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Accelerated free-breathing whole-heart 3D T2 mapping with high isotropic resolution

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Accelerated Free-Breathing Whole-Heart 3D T2 Mapping with High Isotropic Resolution

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ABSTRACT

Purpose: To enable free-breathing whole-heart 3D T2 mapping with high isotropic resolution in a clinically feasible and predictable scan time. This 3D Motion-corrected Undersampled Signal maTched (MUST)-T2 map is achieved by combining an undersampled motion-compensated T2-prepared Cartesian acquisition with a high-order patch-based reconstruction.

Methods: 3D MUST-T2 mapping acquisition consists of an ECG-triggered, T2-prepared, balanced steady-state free precession sequence with non-selective saturation pulses. Three undersampled T2-weighted volumes are acquired using a 3D Cartesian variable-density sampling with increasing T2 preparation times. A 2D image-based navigator is used to correct for respiratory motion of the heart and allow 100% scan efficiency. Multi-contrast HD-PROST reconstruction is used in concert with dictionary matching to generate 3D T2 maps. The proposed framework was evaluated in simulations, phantom experiments, and in vivo (10 healthy subjects, 2 patients) with 1.5mm³ isotropic resolution. 3D MUST-T2 was compared against standard multi-echo spin-echo sequence (phantom) and conventional breath-held single-shot 2D SSFP T2 mapping (in-vivo).

Results: 3D MUST-T2 showed high accuracy in phantom experiments ($R^2 > 0.99$). The precision of T2 values was similar for 3D MUST-T2 and 2D bSSFP T2 mapping in-vivo (5 ± 1 ms vs. 4 ± 2 ms, $P = 0.52$). Slightly longer T2 values were observed with 3D MUST-T2 in comparison to 2D bSSFP T2 mapping (50.7 ± 2 ms vs. 48.2 ± 1 ms, $P < 0.05$). Preliminary results in patients demonstrated T2 values in agreement with literature values.

Conclusion: The proposed approach enables free-breathing whole-heart 3D T2 mapping with high isotropic resolution in ~8 min, achieving accurate and precise T2 quantification of myocardial tissue in a clinically feasible scan time.

Keywords: myocardial T2 mapping, T2 quantification, fast imaging, motion correction, isotropic resolution

INTRODUCTION

Quantitative myocardial T2 mapping has emerged as a promising tool for edema characterization and detection of subtle myocardial inflammation in patients with acute myocardial infarction, myocarditis, dilated cardiomyopathy, sarcoidosis, and autoimmune cardiomyopathies (1–4).

Myocardial T2 mapping is usually performed by acquiring several ECG-triggered T2-weighted (T2w) images, with different amounts of T2 decay through T2-preparation pulses. A map of T2 relaxation times is then generated by fitting the series of weighted images to an exponential decay model on a pixel-by-pixel basis. Current clinical protocols usually perform myocardial T2 mapping with a two-dimensional (2D) single-shot steady-state free-precession sequence (T2p-SSFP), acquiring three T2-prepared images in a single-breathhold every two to three heartbeats to allow for full T1 recovery (3). Multiple short-axis slices are usually acquired at the basal, mid-ventricular and apical level.

However, the use of 2D acquisitions with fairly thick slices and the associated partial volume effects undermine the full potential of myocardial T2 mapping, particularly in hypertrophic cardiomyopathies where the pathological tissues are often complex three-dimensional structures with differing T2 values (5–7). Furthermore, 2D sequences, typically acquired during breath holding, regularly suffer from respiratory and cardiac motion between the T2w images, mainly due to imperfect breath-holding or variable heart rate (8). Although robust non-rigid motion-correction techniques have been proposed to correct for residual motion and improve map quality, such techniques are relatively complex, computationally expensive and only correct for in-plane motion (9–11).

A free-breathing 3D T2 mapping approach with high isotropic spatial resolution may have the potential to increase diagnostic accuracy in patients with acute myocardial injury (e.g., NSTEMI patients (12,13)), and improve the detection of cardiac involvement in patients with systemic sarcoidosis (14).

Three-dimensional (3D) myocardial T2 mapping techniques have been proposed to address the limitations of 2D imaging by allowing for large coverage of the heart with inherently higher signal-to-noise ratio (SNR). Non-cartesian self-navigated myocardial T2 mapping has been proposed to perform free-breathing 3D myocardial T2 mapping at 3T in ~18 min acquisition time (5,15). Such long scan times, unfortunately, may impede the clinical integration of this technique. A self-navigated hybrid radial-cartesian trajectory was also proposed to perform free-breathing 3D myocardial T2 mapping in less than 5 min, however with low spatial resolution (16). The use of saturation pulses at every heartbeat was proposed to accelerate Cartesian 3D T2 mapping (17). Long resting periods (in the order of 2-3 heartbeats (3,5) are usually needed in T2 mapping to ensure full recovery of the longitudinal magnetization between acquisitions to minimize T1 effects and satisfy the assumption that the equilibrium state magnetization is not affected by heart rate variations throughout the scan. Non-selective 90° saturation pulses reset magnetization history by tipping the longitudinal magnetization of the imaged volume into the transverse plane, thus removing heart rate dependency during the acquisition and allowing for imaging every heartbeat. This approach also eliminates artifacts caused by heart rate variations, at the cost of a reduced SNR and lower precision of T2 values. However, this technique uses prospective diaphragmatic navigator-gated (dNAV) acquisitions and thus leads to prolonged and often unpredictable scan times (~9 min nominal scan time with 30% to 60% respiratory gating efficiency) since only a small fraction of the acquired data is accepted for reconstruction (referred to as low scan efficiency).

Notwithstanding the continued advancements, myocardial 3D T2 mapping still faces substantial technical challenges which in turn may limit its applicability in clinical practice. In this study, we sought to achieve high isotropic spatial resolution 3D Cartesian whole-heart myocardial T2 mapping in a short and predictable scan time of ~8 min by combining a highly accelerated saturation-based free-breathing myocardial T2 mapping sequence with 2D image-based navigator (iNAV) based respiratory motion correction. A recently proposed high-dimensionality undersampled patch-based reconstruction (HD-PROST) (18) is employed in concert with dictionary matching, based on the Extended Phase Graph

(EPG) formalism (19), to allow for accurate and precise myocardial T2 maps. The proposed framework was validated in simulations, phantom and healthy subject experiments, while its initial clinical feasibility was shown for two patients with suspected cardiovascular disease.

METHODS

Acquisitions were performed on a 1.5T MR scanner (Magnetom Aera, Siemens Healthcare, Erlangen, Germany) with a dedicated 18-channel body coil and a 32-channel spine coil. Written informed consent was obtained from all healthy subjects and patients before undergoing MRI scans and the study was approved by the National Research Ethics Service. Numerical simulations, reconstructions and analysis were performed on a workstation with a 16-core Dual Intel Xeon Processor (2.3 GHz, 256GB RAM).

Accelerated Whole-heart 3D T2 Mapping Sequence

The proposed myocardial 3D Motion corrected Undersampled Signal maTched (MUST)-T2 mapping sequence is shown in Figure 1. A saturation pulse is performed right after the R-wave with a constant T_{SAT} time from the data acquisition. T_{SAT} is set to the maximal available time allowed by the sequence to guarantee enough magnetization recovery before the next acquisition. This approach allows efficient imaging at every heartbeat, avoiding the use of multiple recovery periods (17). Subsequently, an adiabatic T2 prepared pulse with variable echo time (TE_{T2prep}) is performed, followed by a balanced steady-state free-precession (bSSFP) read-out. An adiabatic T2-prep module (Silver-Hoult type) is employed due its good insensitivity to B1 and B0 inhomogeneities (20). Three T2w volumes are acquired sequentially with different T2-weightings ($TE_{T2prep} = [0, 28, 55]$ ms).

A 3D Cartesian variable-density trajectory with spiral profile order (VD-CASPR) (21,22) is employed to allow for fast acquisition of the three T2-prepared volumes. This trajectory samples the k_y - k_z phase-encoding plane following approximate spiral interleaves on the Cartesian grid with variable density along each spiral arm and with two successive spiral interleaves being rotated by the golden angle. A golden angle rotation (21,23) between

different contrast acquisitions was incorporated to introduce incoherently distributed aliasing along the contrast dimension and noise-like artifacts in the spatial dimension (Supporting Information Figure S1).

A 2D low-resolution iNAV (24) precedes the 3D acquisition at every heartbeat to enable 2D translational respiratory motion estimation/compensation (superior-inferior and right-left directions). This technique, already validated for coronary MR angiography (24) and multi-contrast cardiac MRI (25), enables 100% scan efficiency with predictable scan time, resulting in ~2-3 times acceleration compared to dNAV-based acquisitions. 2D iNAVs are obtained by spatially encoding the startup echoes of the bSSFP T2 mapping sequence. 2D translational motion is estimated using a template-matching algorithm with normalized cross-correlation as similarity measure, with the template manually selected around the heart during acquisition planning. Motion compensation of the three volumes is performed by modulating the k-space data with a linear phase shift to a reference respiratory position selected at end-expiration (24).

Multi-Contrast HD-PROST Reconstruction

Multi-contrast HD-PROST (18,22) is employed to reconstruct the three undersampled T2w volumes. HD-PROST exploits local (i.e., within a patch), non-local (i.e., between similar patches within a neighborhood) and contrast (i.e., between T2w images) redundancies of the 3D volumes in an efficient low-rank formulation. The reconstruction is formulated as an iterative two-step process: 1) an L2-norm regularized parallel-imaging reconstruction using the denoised multi-contrast data from step 2 as a prior (optimization 1), and 2) an efficient high-order low-rank patch-based denoising (optimization 2, Supporting Information Figure S2). The first step is optimized by gradient descent, whereas the second step is optimized through high-order low-rank tensor decomposition. The performance of HD-PROST reconstruction relies mainly on two parameters that need to be carefully tuned in order to get the best reconstruction quality: i) the patch size ($N = 5 \times 5 \times 5$ pixels in this study), reflecting the degree of structural information within each patch; and ii) the high-

order singular value truncation parameter ($\lambda_p = 0.1$ in this study) which controls the amount of regularization.

HD-PROST reconstruction was implemented and performed offline using the algorithm described in (18). Reconstruction parameters were empirically optimized (as previously reported) and are illustrated in Supporting Information Figure S2. We refer the reader to (18,26) for a detailed description of HD-PROST and the associated reconstruction parameters.

Numerical Simulations

Usually in myocardial T2 mapping, the acquisition of each T2-weighted image is followed by a resting period of ~2-3 heartbeats to allow for full longitudinal magnetization relaxation. Numerical EPG simulations were first performed to investigate the impact of removing recovery heartbeats, and integrating saturation pulses, on the longitudinal magnetization of 3D MUST-T2 for tissues with different relaxation times T1. Simulations were performed for a T2 of 50 ms and varying T1 values (ranging from 700 ms to 1200 ms) with and without saturation pulses. Other relevant parameters used in the simulations were $TE_{T2prep} = 55$ ms, repetition time (TR) = 3.2 ms, trigger delay = 856 ms, data-acquisition window of 100 ms, and a simulated heart rate of 60 beats per minute (bpm).

Dictionary Generation and Matching

3D MUST-T2 dictionaries are simulated using the EPG formalism (19,27,28) for a range of T2 values. For both phantom and in vivo experiments, the dictionaries are calculated matching the subject-specific acquisition parameters with T2s in the range [minimum: step size: maximum] of [4:2:100, 105:5:200, 210:10:450] ms. Simulations show that the proposed method is not dependent on the used T1 value (in the range of interest) for dictionary generation (Supporting Information Figure S3, where the simulation results are shown for different T1 values ranging from 850 ms to 1200 ms with a step size of 50 ms), thus T1 is kept constant at 1100 ms for the phantom and in-vivo experiments. T2 maps are obtained by voxel-wise matching of the measured and normalized signal to the closest

(minimum least square) EPG-based dictionary entry. The choice of dictionary-based matching versus conventional mono-exponential curve fitting is justified in Supporting Information Figure S4.

Phantom Experiments

The proposed ECG-triggered 3D MUST-T2 mapping sequence was evaluated in a standardized (TIMES) T1/T2 phantom containing nine agarose-based tubes with relevant cardiac T1 and T2 combinations (range, T1: 255 ms to 1489 ms, T2: 44 ms to 243 ms) (29). Scan parameters for 3D MUST-T2 included: TR = 3.13 ms, echo time (TE) = 1.37 ms, flip angle (FA) = 90°, field-of-view (FOV) = 187x187x156 mm³, 1.5 mm³ isotropic resolution, bandwidth (BW) = 908 Hz/pixel, data-acquisition window = 100 ms, TE_{T2prep} = [0, 28, 55] ms. Reference T2 relaxation times for each vial were obtained using a multi-echo spin-echo (SE) sequence with eight TEs ranging from 10 ms to 640 ms. In addition, conventional ECG-triggered 2D T2p-SSFP was performed for comparison purposes with the following imaging parameters: 1.9 x 1.9 mm² in-plane resolution, slice thickness = 8 mm, TR/TE = 3.11/1.38 ms, linear k-space reordering, BW = 1184 Hz/pixel, TE_{T2prep} = [0, 25, 55] ms, FA = 70°, 3 recovery beats, GRAPPA factor 2 with 36 k-space auto-calibration lines. The T2 relaxation times were obtained by mono-exponential curve fitting for both SE and T2p-SSFP sequences.

Impact of heart rate on T2 accuracy

The impact of heart rate differences on T2 accuracy was assessed by performing multiple 3D MUST-T2 phantom acquisitions with different simulated heart rates (ranging from 50 bpm to 100 bpm, step size 10 bpm). The trigger delay was set to 70% of the R-R interval and ranged from 420 ms to 840 ms, while the saturation time T_{SAT} was always set to the maximum allowed time (ranging from 370 ms to 790 ms). The acquisitions were performed fully sampled using the previously described VD-CASPR sampling.

Impact of acceleration on T2 accuracy

To study the impact of accelerating 3D MUST-T2 on the accuracy of the T2 values, several phantom acquisitions were performed with different undersampling factors ranging from 1-fold to 5-fold (step size 1). Additional acquisition parameters included: simulated heart rate of 60 bpm, trigger delay of 680 ms, and saturation time $T_{SAT} = 630$ ms.

Data Analysis

Circular regions of interest were drawn on each vial for 3D MUST-T2, SE and 2D T2p-SSFP sequences. For each vial, the average T2 value was measured and agreement between SE, 2D T2p-SSFP T2 values and the proposed approach was assessed using linear regression.

In Vivo Experiments

Healthy Subjects

Ten healthy subjects (5 men and 5 women, mean age: 30-year-old, range: 26-36 years) with no history of cardiovascular disease underwent ECG-triggered free-breathing 3D whole-heart T2 mapping using the proposed 3D MUST-T2 acquisition approach. Relevant scan parameters included: FOV = 320 x 320 x 84-108 mm³, slice-oversampling 22%, 1.5 mm³ isotropic resolution, FA = 90°, $TE_{T2prep} = [0, 28, 55]$ ms, subject-dependent mid-diastolic trigger delay (mean: 672 ms, range: 521-952 ms), acquisition window (mean: 97 ms, range: 80-108 ms), T_{SAT} (range: 470-900 ms), acceleration factor of 5x, 14 linear ramp-up pulses for iNAV, and Hanning-filtered sinc pulse with a duration of 1 ms and time-bandwidth product of 4.5. To ensure adequate fat suppression, a spectral pre-saturation with inversion recovery (SPIR) was applied before imaging. All 3D MUST-T2 mapping acquisitions were performed in the coronal plane.

Conventional 2D T2p-SSFP T2 mapping (3) was acquired for each subject for comparison purposes. Acquisition parameters were the same as for the phantom experiments. Three short-axis slices (basal, mid-cavity, apical) were acquired in three separate breath-holds of ~10 seconds each. A non-rigid motion correction was carried out inline to compensate for

in-plane motion between the three 2D T2w images (11). Subsequently, T2 maps were obtained by mono-exponential curve fitting.

Patients

The feasibility and preliminary clinical performance of the proposed 3D MUST-T2 sequence was assessed in two patients (2 men, age: 42-year-old and 50-year-old) with suspected cardiovascular disease. The same acquisition and reconstruction parameters as in the healthy subject study were used. The patient-specific saturation times were $T_{SAT} = 525$ ms (patient #1, average heart rate: 75 bpm, acquisition window = 98 ms) and $T_{SAT} = 595$ ms (patient #2, average heart rate: 65 bpm, acquisition window = 100 ms). Conventional 2D T2p-SSFP T2 mapping was acquired for each patient with same parameters as in the healthy subject study.

Data Analysis

3D MUST-T2 maps were reformatted in the short-axis view to match the 2D T2p-SSFP slices. Regional differences in left ventricular T2 relaxation times were assessed according to the 16-segment model of the American Heart Association (AHA) (30). T2 measurements were reported as mean \pm standard deviation and assessed using Student's t-test. Statistical differences in regional T2 values among reformatted basal, mid-ventricular and apical short-axis slices were analyzed using repeated-measures one-way analysis of variance (ANOVA) with Bonferroni post-hoc comparisons. All statistical analyses were performed using MATLAB (v7.1, The MathWorks, Natick, MA), and statistical significances were defined as a P value < 0.05 .

RESULTS

Numerical Simulations

The impact of recovery times on the signal intensity (longitudinal magnetization) is depicted in Figure 2a-b for multiple T1 relaxation times (ranging from 700 ms to 1200 ms). While a clear dependency was observed when no saturation pulse is applied, necessitating

~2-3 resting periods to recover 96% of the signal intensity (Figure 2a), applying a ‘reset’ saturation pulse (17) at every heartbeat avoids recovery periods, at the cost of a lower signal intensity (Figure 2b).

Phantom Experiments

Average T2 values obtained in the phantom experiments when increasing the simulated heart rate (from 50 bpm to 100 bpm) are depicted in Figure 2c. T2 relaxation times measured with the proposed 3D MUST-T2 sequence showed no to little sensitivity to change of heart rate for all vials in comparison to SE reference measurements.

Accuracy of the T2 values obtained with the proposed 3D MUST-T2 approach in phantom is shown in Figure 3 for different acceleration factors. Excellent linear correlation was found between 3D MUST-T2 and the ground-truth T2 values obtained with SE, with high coefficients of determination ($R^2 > 0.99$) for all acceleration factors (1x to 5x), suggesting high accuracy of the proposed 3D sequence even for high acceleration factors. Lower linear correlation ($R^2 = 0.95$) was observed for conventional 2D T2p-SSFP in comparison to reference SE measurements. Bias between SE and 2D T2p-SSFP with linear order acquisitions has been reported previously (3).

Bland-Altman analysis demonstrated good T2 agreement for all 31 slices of 3D MUST-T2 (Supporting Information Figure S5). The mean differences with 95% confidence interval (CI) between 3D MUST-T2 and SE were 0.6 ms (95% CI, -2.1 ms to 0.89 ms) for short T1 myocardium ($[T2,T1] = [48,803]$ ms), 0.6 ms (95% CI, -3.7 to 2.5 ms to ms) for medium T1 myocardium ($[T2,T1] = [48,1090]$ ms), and 1.4 ms (95% CI, -4.9 ms to -2.0 ms) for long T1 myocardium ($[T2,T1] = [50,1333]$ ms).

In Vivo Experiments

All healthy subject and patient acquisitions/reconstructions were performed successfully, and analysis results are reported hereafter.

Healthy Subjects

The average acquisition time of the proposed free-breathing 3D MUST-T2 sequence in healthy subjects was $6\text{min}43\text{s} \pm 1\text{min}37\text{s}$ (range 4–10 minutes, heart rate range: 38–85 bpm) with 100% scan efficiency. Translational motion estimation and correction was performed in about 20s, while the average reconstruction time (including HD-PROST reconstruction and dictionary matching) was about 3 min. Representative T2 maps from three healthy subjects acquired with the proposed 3D MUST-T2 sequence and the conventional 2D T2p-SSFP sequence are shown in Figure 4. Both free-breathing 3D MUST-T2 and breath-held 2D T2p-SSFP show comparable visualization of the left ventricle and surrounding structures (e.g., papillary muscles). Reconstructed T2 maps from additional healthy subjects are shown in Supporting Information Figure S6 and Supporting Information Figure S7.

Bull's eye plots based on the AHA's 16-segment model of the left ventricle obtained with 3D MUST-T2 and 2D T2p-SSFP mappings are depicted in Figure 5a. A small, although significant, overestimation of regional T2 values, over the whole myocardium, was observed with 3D MUST-T2 in comparison to 2D T2p-SSFP mapping (50.7 ± 1.7 ms for 3D MUST-T2 versus 48.2 ± 1.3 ms for 2D T2p-SSFP, $P < 0.05$). We found no statistical differences in regional T2 values between segments with 3D MUST-T2 for all subjects ($P = 0.6$). A small overestimation of septal T2 values was observed with 3D MUST-T2 in comparison to 2D T2p-SSFP mapping with linear k-space reordering (mean difference: -4.2 ms, $\pm 95\%$ confidence interval: -10.4/2.0 ms, Figure 5b). Precision of T2 values was similar for both techniques (5 ± 1 ms for 3D MUST-T2 versus 4 ± 2 ms for 2D T2p-SSFP, $P = 0.520$, Figure 5c). The corresponding average coefficient of variation for the proposed 3D MUST-T2 approach was similar to that of the 2D conventional sequence (9.13% versus 9.09%, respectively, $P = 0.097$). There were no statistical differences in mean T2 values with 3D MUST-T2 among basal, mid-ventricular and apical slices for all subjects ($P = 0.655$).

The effect of heart rate differences across healthy subjects on T2 values is shown in Figure 2d. T2 measurements obtained from 3D MUST-T2 in vivo showed no significant correlation with heart rate ($T2 = 0.026 \times \text{heart rate} + 49$ ms, $P = 0.919$).

Eight short-axis slices of the left ventricular myocardium for one representative healthy subject obtained with the proposed 3D MUST-T2 approach are shown in Figure 6. The reconstructed T2w images and the corresponding T2 maps are included. No noticeable residual undersampling artifacts were observed on the native T2w images, and corresponding T2 maps, for the entire left ventricle.

Since MUST-T2 acquisitions were performed with isotropic spatial resolution and whole-heart coverage, the T2 maps can be reformatted in any arbitrary plane. This advantage is best appreciated in Figure 7, where reformats in multiple standard orientations (short-axis, vertical long-axis, three-chamber and four-chamber) are shown for a healthy subject.

The need for using 2D iNAVs to correct for respiratory motion is shown in Supporting Information Figure S8, where the T2 maps of two healthy subjects are shown with and without 2D translational motion correction. Motion corrected T2 maps result in better visualization of the myocardium as compared to the non-motion-corrected T2 maps, which show some spatial blurring.

Patients

No cardiac findings were observed in the patient study. The acquisition times of the proposed 3D MUST-T2 sequence were 7 min 23 seconds (patient #1, mean heart rate: 75 bpm) and 8 min 43 seconds (patient #2, mean heart rate: 65 bpm). Figure 8 depicts the reconstructed apical, mid-cavity and basal T2 map slices, for the two patients, using the proposed 3D MUST-T2 framework compared with the current clinical reference maps (breath-held 2D T2p-SSFP). The proposed 3D MUST-T2 produces T2 maps with visual appearance comparable to the conventional 2D T2p-SSFP technique. Mean septal T2 relaxation times were similar between the two techniques (mid-ventricular slice: patient #1: 48.2 ± 4 ms 3D MUST-T2 versus 46.3 ± 3 ms 2D T2p-SSFP, and patient #2: 51.7 ± 7 ms 3D MUST-T2 versus 50.8 ± 4 ms 2D T2p-SSFP).

DISCUSSION

In this study, we proposed a framework for highly accelerated free-breathing whole-heart T2 mapping that combines 2D translational respiratory motion correction, with a golden angle variable density spiral-like Cartesian trajectory and a recently introduced HD-PROST reconstruction. The proposed 3D MUST-T2 approach enables accurate and precise high-resolution isotropic (1.5mm^3) 3D whole-heart T2 mapping acquisitions in a fast and predictable scan time.

The performance of the proposed 3D T2 mapping framework was assessed in simulations, phantom experiments, and ten healthy subjects, while initial clinical feasibility was demonstrated in two patients with suspected cardiovascular disease.

3D MUST-T2 uses a saturation pulse to reset the magnetization immediately after the R-wave, as proposed by Ding et al. (17), and thus is mostly independent of heart rate variations. Another advantage of using saturation pulses compared to other T2 mapping techniques (3,5,16,31) is that recovery periods between subsequent heartbeats are not needed, thus reducing the total acquisition time.

Further acceleration through undersampling is crucial to achieve high isotropic resolution in a clinically feasible scan time. In phantom experiments, we observed that acceleration factors of up to 5-fold led to accurate T2 values ($R^2 > 0.99$) with respect to reference SE measurements. Besides the use of an efficient undersampling trajectory, the acquisition of low-resolution 2D iNAVs at every heartbeat also permits a substantial reduction in scan time by allowing 100% respiratory scan efficiency (no data rejection) and predictable scan time (24), as opposed to other respiratory-gated T2 mapping techniques based on dNAV acquisition (17). Other free-breathing T2 mapping techniques have been proposed to allow for 100% scan efficiency and predictable scan time. Van Heeswijk et al. (5) proposed a respiratory self-navigated 3D sequence to acquire isotropic 3D T2 maps with resolution of 1.7 mm^3 in a predictable scan time of $\sim 18\text{min}$ at 3T, while Basha et al. (32) proposed a 2D multi-slice sequence with slice tracking. The significant scan time reduction achieved with 3D MUST-T2 was exploited to acquire in vivo isotropic whole-heart Cartesian T2 maps in clinically feasible scan times ($\sim 8\text{ min}$), while a fully sampled acquisition would have

required >35 mins. The total imaging time for 3D MUST-T2 being mainly affected by the subject's heart rate and the number of slices needed to cover the whole-heart in the anterior-posterior direction. For comparison, the conventional breath-hold 2D T2p-SSFP sequence would have required between 5 and 7 minutes to cover the entire heart (assuming 7 s breathing commands, 10 s resting time between acquisitions, 10 s breath-hold, and assuming that 11 to 16 slices are needed to cover the heart). The proposed 3D T2 mapping sequence can also be performed with lower anisotropic resolution (e.g., $2.0 \times 2.0 \times 6.0 \text{ mm}^3$ as achieved in (16)), that will result in shorter scan times and inherently co-registered slices due to the 3D nature of the acquisition.

The acquisition of undersampled data comes, however, at the cost of significant loss of information which needs to be recovered. Multi-contrast HD-PROST reconstruction takes advantage of the local, non-local and contrast redundancies found in the T2w images, to recover whole-heart T2 maps with negligible remaining aliasing artifacts. The measurements of myocardial T2 values by 3D MUST-T2 in healthy subjects (average septal $T2 = 50.8 \pm 3 \text{ ms}$) were in good agreement with in vivo values published in a previous study at 1.5T with centric ordering ($T2 = 50 \pm 4 \text{ ms}$ (33)). T2 overestimation with respect to the conventional breath-hold 2D T2p-SSFP sequence was observed, with a bias of $4.2 \pm 6.2 \text{ ms}$. This overestimation was likely due to the choice of centric (3D MUST-T2) versus linear (2D T2p-SSFP) k-space ordering, as observed by Giri et al. (3). Other confounding factors such as heart rate variations (34), not present in the phantom study, or the use of fat saturation and adiabatic T2 preparation pulses could also explain this overestimation in vivo and will be further explored.

Although high acceleration factors were reached with the proposed 3D sequence, precision of T2 values in vivo did not show significant deviations from the conventional 2D T2p-SSFP acquisitions ($4.6 \pm 1 \text{ ms}$ vs. $4.3 \pm 2 \text{ ms}$, $P = 0.520$), and were similar to previously reported values at 3T (5,17). This can be attributed to the good performance of HD-PROST reconstruction in concert with the VD-CASPR trajectory, which limits the propagation of noise in the T2w images, noise being a severe side effect of saturation-based MR mapping techniques (16,35,36).

Dictionary-based matching was used in this study to accurately estimate myocardial T2 values by pre-generating a dictionary representative of the proposed T2 mapping sequence, and whose elements are composed of simulated signal evolution curves (28). Our findings in phantom experiments showed that dictionary-based matching has the potential to accurately estimate myocardial T2 values acquired with both 3D MUST-T2 and conventional T2p-bSSFP, whereas a T2 bias was observed with conventional mono-exponential fitting for both methods (Supporting Information Figure S4). This can be partly explained by the fact that mono-exponential fitting does not accurately describe the acquisition parameters and the signal evolution during acquisition, such as bSSFP T1/T2 ratio of tissue, subject-specific heart-rate, number of segments per heartbeat, and number of linear ramp-up pulses. Therefore, the use of dictionary-based matching could also improve conventional 2D T2p-SSFP and potentially reduce the bias observed with linear phase encoding.

A limitation of the current framework is that only 2D translation respiratory motion correction was performed to ensure fast reconstruction times. It has been shown in previous reports that non-rigid motion registration can improve reproducibility and spatial variability of 2D T2 mapping techniques (8,11). While this issue was not shown to be significant in the present experiments, it can be overcome by incorporating 3D non-rigid respiratory motion correction directly in the image reconstruction (37–39). Another alternative to deal with large motion between the T2w images is to extend the proposed HD-PROST reconstruction to enable motion-resolved reconstruction by extending the searching neighborhood for patch selection to the spatial-temporal dimension (40).

In this study, mid-diastolic imaging was employed to minimize cardiac motion and guarantee long saturation times. However, in subjects with highly variable heart rates or high heart rates, end-systolic imaging may be preferred. Future studies will investigate the effect of shorter saturation times on the accuracy and precision of saturation-based T2 mapping, however our phantom experiments demonstrate that accuracy is not affected for different heart rates between 50 and 100 bpm.

Moreover, incomplete saturation of fat signal can occur in some regions of the T2w images, especially around the epicardial fat area. This effect can lead to fat-myocardium partial volume effect, apparent distortion and loss of sharpness on the T2 map and may alter the T2 measurements. Further optimized fat suppression for each T2w image will be investigated in the future to alleviate this difficulty.

Translational motion estimation and correction was performed inline in the scanner software while HD-PROST reconstruction and dictionary matching were performed offline. The efficient multithreaded implementation of HD-PROST allowed for fast T2 map reconstruction (in the order of 3 minutes). Further speedup, to reach sub-minute runtime, could be achieved by implementing the reconstruction on multiple GPUs and using coil compression strategies (41).

It should be noted that 3D MUST-T2 is based on a T2-prepared sequence commonly used in coronary MR angiography (42). The acceptable contrast provided by the last T2w volume ($TE_{T2prep} = 55$ ms, Figures 6 and 7) could also be exploited to visualize whole heart cardiac and proximal coronary artery anatomy. Thus, 3D MUST-T2 may be used for the simultaneous assessment of cardiac and coronary anatomy and myocardial T2 relaxation times in a highly simplified and efficient single free-breathing acquisition. This additional gain could potentially benefit patients with acute non-ST-segment elevation myocardial infarction where obstructive coronary artery disease and myocardial edema are often characteristic (13).

The proposed free-breathing T2 mapping framework could benefit many cardiovascular patients with severe shortness of breath and where imaging under breath-holding is often challenging. Preliminary insights into the potential of the proposed 3D MUST-T2 mapping technique in a clinical setting was provided for two patients with suspected cardiovascular disease. While no pathologies were observed in this proof-of-concept study, scanning patients often leads to new challenges (e.g., variable heart rate, irregular breathing pattern, poor compliance), resulting in degraded image quality. Higher amplitude in respiratory motion of the heart, as provided by the 2D iNAVs, was observed in patients compared to

healthy controls (Supporting Information Figure S9). Mean septal T2 values measured on the two patients were comparable to that of the healthy subjects. Besides T2 relaxation times conform to the literature (Figure 8), the 3D whole-heart isotropic coverage of the proposed technique offers the opportunity to reformat the T2 maps in any desired orientation, which can be particularly useful for the comprehensive assessment of pathological tissues with complex geometry (6).

The proposed framework also shares similarities with the recent qBOOST-T2 approach (43) that enables co-registered bright-blood and black-blood whole-heart imaging, together with T2 quantification and coronary lumen visualization, through the use of an inversion pulse every three heartbeats. While the latest technique may be preferred whenever coronary assessment or pre-contrast black-blood images are clinically required, a thorough comparison of the two approaches in large patient cohorts will need to be studied.

Finally, the proposed fast and efficient framework holds promise for wider cardiac applications such as high-resolution motion compensated 3D T1 mapping and 3D joint T1-T2 mapping (44–49); both of which will be investigated in future works.

CONCLUSION

A novel approach was developed to enable free-breathing whole-heart 3D T2 mapping with high isotropic spatial resolution (1.5mm^3) in a clinically feasible scan time (<8 min with 100% scan efficiency and predictable scan time). The proposed 3D MUST-T2 framework achieved accurate T2 quantification in phantom and in vivo with fast acquisition. 3D-MUST T2 mapping may have potential to aid the management of many cardiomyopathies in which fast and efficient free-breathing acquisitions are key to patient comfort, while high isotropic resolution is crucial to accurately map tissue heterogeneity. Further studies to assess the clinical utility of 3D MUST-T2 mapping in patients with myocardial inflammation are now warranted.

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Figure Captions

Figure 1 Schematic overview of the proposed free-breathing 3D MUST-T2 technique for whole-heart myocardial T2 mapping. Three T2-prepared volumes are acquired sequentially with increasing $TE_{T2\text{prep}}$ ([0,28,55] ms). A nonselective saturation pulse is applied immediately after the ECG R-wave to avoid recovery heartbeats. A 2D image-navigator is acquired to enable translational respiratory motion correction of the heart and shorter and predictable scan times. A golden-angle shifted variable density Cartesian undersampling is employed to achieve clinically feasible scan times. All T2 prepared volumes are reconstructed simultaneously with HD-PROST (18). A dictionary is then simulated and matched to the measured signal to generate the whole-heart T2 maps. Abbreviations: TD, trigger delay; T_{SAT} , saturation time; AW, acquisition window

Figure 2 Results from EPG simulations show the effect of the saturation pulse on the MR signal evolution. (A) shows the simulated magnetization obtained with the EPG formalism for different recovery times (ranging from 0 to 9 seconds) when the saturation pulse is not used. The signals were generated for tissues with a T2 of 50 ms, varying T1s (ranging from 700 ms to 1200 ms), $TE_{T2\text{prep}} = 50$ ms, and a simulated heart rate of 60 bpm. For long T1s, a minimum of ~6 idle heartbeats are needed to allow for full recovery of the longitudinal magnetization. When the saturation pulse is applied at every heartbeat (B), idle heartbeats are not required for signal recovery, at the cost of lower signal intensity. (C) Evolution of the matched T2 values obtained with the proposed 3D MUST-T2 mapping sequence over different simulated heart rates (ranging from 50 bpm to 100 bpm) for each phantom vial. The proposed approach is mostly insensitive to heart rate variations, even for long T1s. (D) The effect of different heart rates across all healthy subjects ($N = 10$) on mean T2 values is shown.

Figure 3 Phantom accuracy for the proposed 3D MUST-T2 sequence. Plots are comparing the mean T2 values derived from the nine vials for five different acceleration factors with the ground truth T2 values (measured by SE with eight TEs from 10-640 ms (29)), conventional 2D T2p-SSFP mapping (green) and the proposed 3D MUST-T2 sequence. T2

accuracy is preserved with the proposed approach with excellent agreement with the reference T2 values, even for high acceleration (x5). T2 values for the last tube (T2 = 250ms) were out of range (>300 ms) for the 2D T2p-SSFP sequence and therefore are not shown.

Figure 4 T2 maps obtained using the proposed free-breathing 3D MUST-T2 sequence and the conventional breath-held 2D T2p-SSFP sequence are shown for three healthy subjects. 3D MUST-T2 slices were reformatted to short-axis to match the 2D T2 map acquisitions. Good visualization of the myocardium and surrounding structures can be observed on the 3D MUST-T2 maps. Acquisition times are expressed as [min:sec]. Abbreviations: BPM, beats per minute; AT, acquisition time

Figure 5 Accuracy and precision of the proposed 3D MUST-T2 mapping sequence. (A) T2 accuracy of the proposed 3D MUST-T2 sequence versus conventional 2D T2p-SSFP, as measured by the mean T2 value are shown in the left ventricular segmentation. T2 values are in good agreement with the literature ($T2 = 50 \pm 4$ ms (33)). The averaged T2 relaxation times over the whole myocardium are shown in the bull's eye plots' center. Accuracy (B) and precision (C) of T2 relaxation times (ms) obtained in the myocardial septum with the proposed 3D MUST-T2 and the conventional 2D T2p-SSFP are shown for the 10 healthy subjects.

Figure 6 Three-dimensional visualization of the acquired T2w images and the corresponding T2 volume. Representative T2w images for subject 2 (acquisition time: 10 min, heart rate = 38 bpm), and the corresponding T2 maps obtained by the proposed 3D MUST-T2. Eight reformatted short-axis slices that cover the heart from apex to base are shown. Uniform distribution of T2 values through the slices over the whole-left ventricle can be observed. The color scale indicates T2 values between 0-120 ms.

Figure 7 Representative T2-prepared images for subject 2 and the corresponding T2 maps obtained with the proposed 3D MUST-T2 sequence. Reformats in short-axis, vertical long-axis, 3-chamber and 4-chamber views are shown.

Figure 8 Short-axis T2 maps at apical, mid-ventricular and basal level for two patients acquired with the proposed free-breathing 3D MUST-T2 framework and the conventional breath-hold 2D T2p-SSFP sequence. The septal T2 relaxation times for each slice are reported as mean \pm standard deviation.

Supporting Information Figure Captions

Additional Supporting Information may be found in the online version of this article.

Supporting Information Figure S1 A 3D Cartesian variable-density trajectory was employed to allow for fast acquisition of multiple T2w images. The Cartesian trajectory with spiral order samples the k_y - k_z phase encoding plane following approximate spiral interleaves on the Cartesian grid with variable density along each spiral arm. In this sketch, the 2 first acquired spirals are shown for each contrast, each spiral containing 20 segments. A golden angle rotation between successive spirals and successive contrasts is applied to introduce incoherently distributed aliasing artifacts along the contrast dimension, and noise-like artifacts in the spatial dimension.

Supporting Information Figure S2 Flowchart of the optimization 2 of the proposed High-Dimensionality Patch-based RecOnSTruction (HD-PROST). Denoising of multiple T2w images is performed using a 3D block matching, which groups and unfolds similar 3D patches in the noisy multi-contrast images to form a low-rank 2D matrix. A third-order tensor is formed by stacking the T2 contrast dimension on the third dimension. The high-order tensor of size N (number of pixels in each patch) \times K (number of similar patches within a neighborhood) \times L (number of T2 contrasts) admits a low multilinear rank approximation and can be compressed, through high-order tensor decomposition, by truncating the multilinear singular vectors that correspond to small multilinear singular values. The outputs of this step are the denoised multi-contrast images which are then used in the joint regularized reconstruction step (optimization 1) as prior knowledge. Reconstruction parameters used in this study are shown (bottom row). We refer the reader to (18) for more information on these parameters. Reconstruction parameter details: N ,

patch size (in pixels); L , number of contrasts; K , number of similar patches; λ_p , threshold value.

Supporting Information Figure S3 Simulations of the proposed T2 mapping sequence were performed using the EPG formalism to assess the effect of T1 in the EPG-based dictionary on the matched T2 value. Signals evolutions for different T1 (from 850 to 1200 with a step size of 50 ms) and T2 (from 42 to 82 with a step size of 8 ms) were generated and matched to a dictionary simulated with fixed T1 (1100 ms) and varying T2s (similar to the one used in the phantom experiment). (A) Matched T2 is plotted as a function of T1. (B) The signal evolutions corresponding to short (T1/T2 = 800/52 ms), medium (T1/T2 = 1100/52 ms), and long (T1/T2 = 1300/52 ms) T1 myocardium were generated for the proposed sequence through EPG simulation. The obtained signal evolutions did not seem to differ, suggesting that the proposed 3D MUST-T2 map sequence with dictionary-based matching is independent of the T1 used in the EPG-based dictionary (matched T2s were the same for the three generated signals and equal to 52 ms). Therefore, for the phantom and in vivo experiments, we kept the T1 constant at 1100 ms.

Supporting Information Figure S4 Conventional mono-exponential fitting and dictionary-based matching for 2D T2p-SSFP T2 mapping in comparison to the proposed 3D MUST-T2 sequence for the phantom study. The proposed 3D acquisition with mono-exponential fitting is also included for comparison purposes. Accurate phantom T2 values, in agreement with reference spin echo, were obtained with the proposed 3D MUST-T2 sequence with dictionary-based matching, however bias is observed with the proposed acquisition when mono-exponential fitting is employed. Bias is also observed with the conventional (linear phase encoding) 2D T2p-SSFP mapping with mono-exponential fitting, however this bias is significantly reduced when dictionary-based matching is employed.

Supporting Information Figure S5 Spatial T2 uniformity over the slice direction is assessed for the phantom study for three vials (corresponding to short, medium and long T1 myocardium). The solid line is the average difference between gold-standard spin echo

and the proposed 3D MUST-T2 mapping sequence, and the dashed lines represent the mean \pm two standard deviations between the two techniques. Good T2 uniformity can be observed with the proposed technique. The mean difference in T2 for the vial corresponding to short T1 myocardium was -0.6 ms [$\pm 95\%$ confidence interval (CI) = -2.1/0.89 ms), -0.6 ms [$\pm 95\%$ CI = -3.7/2.5 ms) for the medium T1 myocardium, and -1.4 ms [$\pm 95\%$ CI = -4.9/2.0 ms) for the long T1 myocardium.

Supporting Information Figure S6 T2 maps obtained using the proposed free-breathing 3D MUST-T2 mapping sequence and the conventional breath-held 2D T2p-SSFP sequence are shown for three additional healthy subjects. 3D MUST-T2 slices were reformatted to short-axis to match the 2D T2 map acquisitions. Representative 16 AHA segments are shown to illustrate how much spatial information was considered for T2 calculation. Acquisition times are expressed as [min:sec]. Abbreviations: BPM, beats per minute; AT, acquisition time.

Supporting Information Figure S7 Axial view of T2 maps acquired using the proposed 3D T2 mapping sequence on 3 healthy subjects. Number of slices was adjusted per subject to cover the left ventricle in the anterior-posterior direction.

Supporting Information Figure S8 Impact of iNAV-based beat-to-beat translation motion correction on 3D MUST-T2 map is shown for two healthy subjects. Reconstructed T2w images ($TE_{T2prep} = 55$ ms) are shown before and after motion correction with the corresponding T2 maps (A). Better visualization of the myocardium can be observed after motion correction with clear delineation of cardiac structures and myocardial walls. Note the blurring observed on the non-motion corrected T2 maps. Plots showing the intensity profiles, taken on the T2w images through the heart-liver interface, are shown in (B).

Supporting Information Figure S9 (A) Foot-head respiratory displacements of the heart obtained from the 2D image navigators at each heartbeat are shown for 2 representative healthy subjects (left) and 2 patients (right). The end-expiration position is used as reference for translational motion estimation. While regular breathing patterns can be observed on the healthy subjects, more irregular breathing patterns with strong motion amplitudes are

observed on patient 1 and patient 2. (B) Average R-R intervals are shown for each healthy subject and patient. Patient 1 presented with irregular cardiac rhythm ($R-R = 838 \pm 211$ ms).

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Accelerated Free-Breathing Whole-Heart 3D T₂ Mapping with High Isotropic Resolution

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ABSTRACT

Purpose: To enable free-breathing whole-heart 3D T2 mapping with high isotropic resolution in a clinically feasible and predictable scan time. This 3D Motion-corrected Undersampled Signal maTched (MUST)-T2 map is achieved by combining an undersampled motion-compensated T2-prepared Cartesian acquisition with a high-order patch-based reconstruction.

Methods: 3D MUST-T2 mapping acquisition consists of an ECG-triggered, T2-prepared, balanced steady-state free precession sequence with non-selective saturation pulses. Three undersampled T2-weighted volumes are acquired using a 3D Cartesian variable-density sampling with increasing T2 preparation times. A 2D image-based navigator is used to correct for respiratory motion of the heart and allow 100% scan efficiency. Multi-contrast HD-PROST reconstruction is used in concert with dictionary matching to generate 3D T2 maps. The proposed framework was evaluated in simulations, phantom experiments, and in vivo (10 healthy subjects, 2 patients) with 1.5mm³ isotropic resolution. 3D MUST-T2 was compared against standard multi-echo spin-echo sequence (phantom) and conventional breath-held single-shot 2D SSFP T2 mapping (in-vivo).

Results: 3D MUST-T2 showed high accuracy in phantom experiments ($R^2>0.99$). The precision of T2 values was similar for 3D MUST-T2 and 2D bSSFP T2 mapping in-vivo ($5\pm1\text{ms}$ vs. $4\pm2\text{ms}$, $P=0.52$). Slightly longer T2 values were observed with 3D MUST-T2 in comparison to 2D bSSFP T2 mapping ($50.7\pm2\text{ms}$ vs. $48.2\pm1\text{ms}$, $P<0.05$). Preliminary results in patients demonstrated T2 values in agreement with literature values.

Conclusion: The proposed approach enables free-breathing whole-heart 3D T2 mapping with high isotropic resolution in ~8 min, achieving accurate and precise T2 quantification of myocardial tissue in a clinically feasible scan time.

Keywords: myocardial T2 mapping, T2 quantification, fast imaging, motion correction, isotropic resolution

INTRODUCTION

Quantitative myocardial T2 mapping has emerged as a promising tool for edema characterization and detection of subtle myocardial inflammation in patients with acute myocardial infarction, myocarditis, dilated cardiomyopathy, sarcoidosis, and autoimmune cardiomyopathies (1–4).

Myocardial T2 mapping is usually performed by acquiring several ECG-triggered T2-weighted (T2w) images, with different amounts of T2 decay through T2-preparation pulses. A map of T2 relaxation times is then generated by fitting the series of weighted images to an exponential decay model on a pixel-by-pixel basis. Current clinical protocols usually perform myocardial T2 mapping with a two-dimensional (2D) single-shot steady-state free-precession sequence (T2p-SSFP), acquiring three T2-prepared images in a single-breathhold every two to three heartbeats to allow for full T1 recovery (3). Multiple short-axis slices are usually acquired at the basal, mid-ventricular and apical level.

However, the use of 2D acquisitions with fairly thick slices and the associated partial volume effects undermine the full potential of myocardial T2 mapping, particularly in hypertrophic cardiomyopathies where the pathological tissues are often complex three-dimensional structures with differing T2 values (5–7). Furthermore, 2D sequences, typically acquired during breath holding, regularly suffer from respiratory and cardiac motion between the T2w images, mainly due to imperfect breath-holding or variable heart rate (8). Although robust non-rigid motion-correction techniques have been proposed to correct for residual motion and improve map quality, such techniques are relatively complex, computationally expensive and only correct for in-plane motion (9–11).

A free-breathing 3D T2 mapping approach with high isotropic spatial resolution may have the potential to increase diagnostic accuracy in patients with acute myocardial injury (e.g., NSTEMI patients (12,13)), and improve the detection of cardiac involvement in patients with systemic sarcoidosis (14).

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Three-dimensional (3D) myocardial T2 mapping techniques have been proposed to address the limitations of 2D imaging by allowing for large coverage of the heart with inherently higher signal-to-noise ratio (SNR). Non-cartesian self-navigated myocardial T2 mapping has been proposed to perform free-breathing 3D myocardial T2 mapping at 3T in ~18 min acquisition time (5,15). Such long scan times, unfortunately, may impede the clinical integration of this technique. A self-navigated hybrid radial-cartesian trajectory was also proposed to perform free-breathing 3D myocardial T2 mapping in less than 5 min, however with low spatial resolution (16). The use of saturation pulses at every heartbeat was proposed to accelerate Cartesian 3D T2 mapping (17). Long resting periods (in the order of 2-3 heartbeats (3,5) are usually needed in T2 mapping to ensure full recovery of the longitudinal magnetization between acquisitions to minimize T1 effects and satisfy the assumption that the equilibrium state magnetization is not affected by heart rate variations throughout the scan. Non-selective 90° saturation pulses reset magnetization history by tipping the longitudinal magnetization of the imaged volume into the transverse plane, thus removing heart rate dependency during the acquisition and allowing for imaging every heartbeat. This approach also eliminates artifacts caused by heart rate variations, at the cost of a reduced SNR and lower precision of T2 values. However, this technique uses prospective diaphragmatic navigator-gated (dNAV) acquisitions and thus leads to prolonged and often unpredictable scan times (~9 min nominal scan time with 30% to 60% respiratory gating efficiency) since only a small fraction of the acquired data is accepted for reconstruction (referred to as low scan efficiency).

Notwithstanding the continued advancements, myocardial 3D T2 mapping still faces substantial technical challenges which in turn may limit its applicability in clinical practice. In this study, we sought to achieve high isotropic spatial resolution 3D Cartesian whole-heart myocardial T2 mapping in a short and predictable scan time of ~8 min by combining a highly accelerated saturation-based free-breathing myocardial T2 mapping sequence with 2D image-based navigator (iNAV) based respiratory motion correction. A recently proposed high-dimensionality undersampled patch-based reconstruction (HD-PROST) (18) is employed in concert with dictionary matching, based on the Extended Phase Graph

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(EPG) formalism (19), to allow for accurate and precise myocardial T2 maps ~~with good image quality.~~ The proposed framework was validated in simulations, phantom and healthy subject experiments, while its initial clinical feasibility was shown for two patients with suspected cardiovascular disease.

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METHODS

Acquisitions were performed on a 1.5T MR scanner (Magnetom Aera, Siemens Healthcare, Erlangen, Germany) with a dedicated 18-channel body coil and a 32-channel spine coil. Written informed consent was obtained from all healthy subjects and patients before undergoing MRI scans and the study was approved by the National Research Ethics Service. Numerical simulations, reconstructions and analysis were performed on a workstation with a 16-core Dual Intel Xeon Processor (2.3 GHz, 256GB RAM).

Accelerated Whole-heart 3D T2 Mapping Sequence

The proposed myocardial 3D Motion corrected Undersampled Signal maTched (MUST)-T2 mapping sequence is shown in Figure 1. A saturation pulse is performed right after the R-wave with a constant T_{SAT} time from the data acquisition. T_{SAT} is set to the maximal available time allowed by the sequence to guarantee enough magnetization recovery before the next acquisition. This approach allows efficient imaging at every heartbeat, avoiding the use of multiple recovery periods (17). Subsequently, an adiabatic T2 prepared pulse with variable echo time (TE_{T2prep}) is performed, followed by a balanced steady-state free-precession (bSSFP) read-out. An adiabatic T2-prep module (Silver-Hoult type) is employed due its good insensitivity to B1 and B0 inhomogeneities (20). Three T2w volumes are acquired sequentially with different T2-weightings ($TE_{T2prep} = [0, 28, 55]$ ms).

A 3D Cartesian variable-density trajectory with spiral profile order (VD-CASPR) (21,22) is employed to allow for fast acquisition of the three T2-prepared volumes. This trajectory samples the k_y - k_z phase-encoding plane following approximate spiral interleaves on the Cartesian grid with variable density along each spiral arm and with two successive spiral interleaves being rotated by the golden angle. A golden angle rotation (21,23) between

different contrast acquisitions was incorporated to introduce incoherently distributed aliasing along the contrast dimension and noise-like artifacts in the spatial dimension (Supporting Information Figure S1).

A 2D low-resolution iNAV (24) precedes the 3D acquisition at every heartbeat to enable 2D translational respiratory motion estimation/compensation (superior-inferior and right-left directions). This technique, already validated for coronary MR angiography (24) and multi-contrast cardiac MRI (25), enables 100% scan efficiency with predictable scan time, resulting in ~2-3 times acceleration compared to dNAV-based acquisitions. 2D iNAVs are obtained by spatially encoding the startup echoes of the bSSFP T2 mapping sequence. 2D translational motion is estimated using a template-matching algorithm with normalized cross-correlation as similarity measure, with the template manually selected around the heart during acquisition planning. Motion compensation of the three volumes is performed by modulating the k-space data with a linear phase shift to a reference respiratory position selected at end-expiration (24).

Multi-Contrast HD-PROST Reconstruction

Multi-contrast HD-PROST (18,22) is employed to reconstruct the three undersampled T2w volumes. HD-PROST exploits local (i.e., within a patch), non-local (i.e., between similar patches within a neighborhood) and contrast (i.e., between T2w images) redundancies of the 3D volumes in an efficient low-rank formulation. The reconstruction is formulated as an iterative two-step process: 1) an L2-norm regularized parallel-imaging reconstruction using the denoised multi-contrast data from step 2 as a prior (optimization 1), and 2) an efficient high-order low-rank patch-based denoising (optimization 2, Supporting Information Figure S2). The first step is optimized by gradient descent, whereas the second step is optimized through high-order low-rank tensor decomposition. The performance of HD-PROST reconstruction relies mainly on two parameters that need to be carefully tuned in order to get the best reconstruction quality: i) the patch size ($N = 5 \times 5 \times 5$ pixels in this study), reflecting the degree of structural information within each patch; and ii) the high-

order singular value truncation parameter ($\lambda_p = 0.1$ in this study) which controls the amount of regularization.

HD-PROST reconstruction was implemented and performed offline using the algorithm described in (18). Reconstruction parameters were empirically optimized (as previously reported) and are illustrated in Supporting Information Figure S2. We refer the reader to (18,26) for a detailed description of HD-PROST and the associated reconstruction parameters.

Numerical Simulations

Usually in myocardial T2 mapping, the acquisition of each T2-weighted image is followed by a resting period of ~2-3 heartbeats to allow for full longitudinal magnetization relaxation. Numerical EPG simulations were first performed to investigate the impact of removing recovery heartbeats, and integrating saturation pulses, on the longitudinal magnetization of 3D MUST-T2 for tissues with different relaxation times T1. Simulations were performed for a T2 of 50 ms and varying T1 values (ranging from 700 ms to 1200 ms) with and without saturation pulses. Other relevant parameters used in the simulations were $TE_{T2prep} = 55$ ms, repetition time (TR) = 3.2 ms, trigger delay = 856 ms, data-acquisition window of 100 ms, and a simulated heart rate of 60 beats per minute (bpm).

Dictionary Generation and Matching

3D MUST-T2 dictionaries are simulated using the EPG formalism (19,27,28) for a range of T2 values. For both phantom and in vivo experiments, the dictionaries are calculated matching the subject-specific acquisition parameters with T2s in the range [minimum: step size: maximum] of [4:2:100, 105:5:200, 210:10:450] ms. Simulations show that the proposed method is not dependent on the used T1 value (in the range of interest) for dictionary generation (Supporting Information Figure S3, where the simulation results are shown for different T1 values ranging from 850 ms to 1200 ms with a step size of 50 ms), thus T1 is kept constant at 1100 ms for the phantom and in-vivo experiments. T2 maps are obtained by voxel-wise matching of the measured and normalized signal to the closest

(minimum least square) EPG-based dictionary entry. The choice of dictionary-based matching versus conventional mono-exponential curve fitting is justified in Supporting Information Figure S4.

Phantom Experiments

The proposed ECG-triggered 3D MUST-T2 mapping sequence was evaluated in a standardized (TIMES) T1/T2 phantom containing nine agarose-based tubes with relevant cardiac T1 and T2 combinations (range, T1: 255 ms to 1489 ms, T2: 44 ms to 243 ms) (29). Scan parameters for 3D MUST-T2 included: TR = 3.13 ms, echo time (TE) = 1.37 ms, flip angle (FA) = 90°, field-of-view (FOV) = 187x187x156 mm³, 1.5 mm³ isotropic resolution, bandwidth (BW) = 908 Hz/pixel, data-acquisition window = 100 ms, TE_{T2prep} = [0, 28, 55] ms. Reference T2 relaxation times for each vial were obtained using a multi-echo spin-echo (SE) sequence with eight TEs ranging from 10 ms to 640 ms. In addition, conventional ECG-triggered 2D T2p-SSFP was performed for comparison purposes with the following imaging parameters: 1.9 x 1.9 mm² in-plane resolution, slice thickness = 8 mm, TR/TE = 3.11/1.38 ms, linear k-space reordering, BW = 1184 Hz/pixel, TE_{T2prep} = [0, 25, 55] ms, FA = 70°, 3 recovery beats, GRAPPA factor 2 with 36 k-space auto-calibration lines. The T2 relaxation times were obtained by mono-exponential curve fitting for both SE and T2p-SSFP sequences.

Impact of heart rate on T2 accuracy

The impact of heart rate differences on T2 accuracy was assessed by performing multiple 3D MUST-T2 phantom acquisitions with different simulated heart rates (ranging from 50 bpm to 100 bpm, step size 10 bpm). The trigger delay was set to 70% of the R-R interval and ranged from 420 ms to 840 ms, while the saturation time T_{SAT} was always set to the maximum allowed time (ranging from 370 ms to 790 ms). The acquisitions were performed fully sampled using the previously described VD-CASPR sampling.

Impact of acceleration on T2 accuracy

To study the impact of accelerating 3D MUST-T2 on the accuracy of the T2 values, several phantom acquisitions were performed with different undersampling factors ranging from 1-fold to 5-fold (step size 1). Additional acquisition parameters included: simulated heart rate of 60 bpm, trigger delay of 680 ms, and saturation time $T_{SAT} = 630$ ms.

Data Analysis

Circular regions of interest were drawn on each vial for 3D MUST-T2, SE and 2D T2p-SSFP sequences. For each vial, the average T2 value was measured and agreement between SE, 2D T2p-SSFP T2 values and the proposed approach was assessed using linear regression.

In Vivo Experiments

Healthy Subjects

Ten healthy subjects (5 men and 5 women, mean age: 30-year-old, range: 26-36 years) with no history of cardiovascular disease underwent ECG-triggered free-breathing 3D whole-heart T2 mapping using the proposed 3D MUST-T2 acquisition approach. Relevant scan parameters included: FOV = 320 x 320 x 84-108 mm³, slice-oversampling 22%, 1.5 mm³ isotropic resolution, FA = 90°, $TE_{T2prep} = [0, 28, 55]$ ms, subject-dependent mid-diastolic trigger delay (mean: 672 ms, range: 521-952 ms), acquisition window (mean: 97 ms, range: 80-108 ms), T_{SAT} (range: 470-900 ms), acceleration factor of 5x, 14 linear ramp-up pulses for iNAV, and Hanning-filtered sinc pulse with a duration of 1 ms and time-bandwidth product of 4.5. To ensure adequate fat suppression, a spectral pre-saturation with inversion recovery (SPIR) was applied before imaging. All 3D MUST-T2 mapping acquisitions were performed in the coronal plane.

Conventional 2D T2p-SSFP T2 mapping (3) was acquired for each subject for comparison purposes. Acquisition parameters were the same as for the phantom experiments. Three short-axis slices (basal, mid-cavity, apical) were acquired in three separate breath-holds of ~10 seconds each. A non-rigid motion correction was carried out inline to compensate for

in-plane motion between the three 2D T2w images (11). Subsequently, T2 maps were obtained by mono-exponential curve fitting.

Patients

The feasibility and preliminary clinical performance of the proposed 3D MUST-T2 sequence was assessed in two patients (2 men, age: 42-year-old and 50-year-old) with suspected cardiovascular disease. The same acquisition and reconstruction parameters as in the healthy subject study were used. The patient-specific saturation times were $T_{SAT} = 525$ ms (patient #1, average heart rate: 75 bpm, acquisition window = 98 ms) and $T_{SAT} = 595$ ms (patient #2, average heart rate: 65 bpm, acquisition window = 100 ms). Conventional 2D T2p-SSFP T2 mapping was acquired for each patient with same parameters as in the healthy subject study.

Data Analysis

3D MUST-T2 maps were reformatted in the short-axis view to match the 2D T2p-SSFP slices. Regional differences in left ventricular T2 relaxation times were assessed according to the 16-segment model of the American Heart Association (AHA) (30). T2 measurements were reported as mean \pm standard deviation and assessed using Student’s t-test. Statistical differences in regional T2 values among reformatted basal, mid-ventricular and apical short-axis slices were analyzed using repeated-measures one-way analysis of variance (ANOVA) with Bonferroni post-hoc comparisons. All statistical analyses were performed using MATLAB (v7.1, The MathWorks, Natick, MA), and statistical significances were defined as a P value < 0.05 .

RESULTS

Numerical Simulations

The impact of recovery times on the signal intensity (longitudinal magnetization) is depicted in Figure 2a-b for multiple T1 relaxation times (ranging from 700 ms to 1200 ms). While a clear dependency was observed when no saturation pulse is applied, necessitating

~2-3 resting periods to recover 96% of the signal intensity (Figure 2a), applying a ‘reset’ saturation pulse (17) at every heartbeat avoids recovery periods, at the cost of a lower signal intensity (Figure 2b).

Phantom Experiments

Average T2 values obtained in the phantom experiments when increasing the simulated heart rate (from 50 bpm to 100 bpm) are depicted in Figure 2c. T2 relaxation times measured with the proposed 3D MUST-T2 sequence showed no to little sensitivity to change of heart rate for all vials in comparison to SE reference measurements.

Accuracy of the T2 values obtained with the proposed 3D MUST-T2 approach in phantom is shown in Figure 3 for different acceleration factors. Excellent linear correlation was found between 3D MUST-T2 and the ground-truth T2 values obtained with SE, with high coefficients of determination ($R^2 > 0.99$) for all acceleration factors (1x to 5x), suggesting high accuracy of the proposed 3D sequence even for high acceleration factors. Lower linear correlation ($R^2 = 0.95$) was observed for conventional 2D T2p-SSFP in comparison to reference SE measurements. Bias between SE and 2D T2p-SSFP with linear order acquisitions has been reported previously (3).

Bland-Altman analysis demonstrated good T2 agreement for all 31 slices of 3D MUST-T2 (Supporting Information Figure S5). The mean differences with 95% confidence interval (CI) between 3D MUST-T2 and SE were 0.6 ms (95% CI, -2.1 ms to 0.89 ms) for short T1 myocardium ($[T2, T1] = [48, 803]$ ms), 0.6 ms (95% CI, -3.7 to 2.5 ms to ms) for medium T1 myocardium ($[T2, T1] = [48, 1090]$ ms), and 1.4 ms (95% CI, -4.9 ms to -2.0 ms) for long T1 myocardium ($[T2, T1] = [50, 1333]$ ms).

In Vivo Experiments

All healthy subject and patient acquisitions/reconstructions were performed successfully, and analysis results are reported hereafter.

Healthy Subjects

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The average acquisition time of the proposed free-breathing 3D MUST-T2 sequence in healthy subjects was $6\text{min}43\text{s} \pm 1\text{min}37\text{s}$ (range 4–10 minutes, heart rate range: 38–85 bpm) with 100% scan efficiency. Translational motion estimation and correction was performed in about 20s, while the average reconstruction time (including HD-PROST reconstruction and dictionary matching) was about 3 min.

Representative T2 maps from three healthy subjects acquired with the proposed 3D MUST-T2 sequence and the conventional 2D T2p-SSFP sequence are shown in Figure 4. Both free-breathing 3D MUST-T2 and breath-held 2D T2p-SSFP show excellent overall visual image quality and image sharpness comparable visualization of the left ventricle and surrounding structures (e.g., papillary muscles). Reconstructed T2 maps from additional healthy subjects are shown in Supporting Information Figure S6 and Supporting Information Figure S7.

Bull's eye plots based on the AHA's 16-segment model of the left ventricle obtained with 3D MUST-T2 and 2D T2p-SSFP mappings are depicted in Figure 5a. A small, although significant, overestimation of regional T2 values, over the whole myocardium, was observed with 3D MUST-T2 in comparison to 2D T2p-SSFP mapping (50.7 ± 1.7 ms for 3D MUST-T2 versus 48.2 ± 1.3 ms for 2D T2p-SSFP, $P < 0.05$). We found no statistical differences in regional T2 values between segments with 3D MUST-T2 for all subjects ($P = 0.6$). A small overestimation of septal T2 values was observed with 3D MUST-T2 in comparison to 2D T2p-SSFP mapping with linear k-space reordering (mean difference: -4.2 ms, $\pm 95\%$ confidence interval: -10.4/2.0 ms, Figure 5b). Precision of T2 values was similar for both techniques (5 ± 1 ms for 3D MUST-T2 versus 4 ± 2 ms for 2D T2p-SSFP, $P = 0.520$, Figure 5c). The corresponding average coefficient of variation for the proposed 3D MUST-T2 approach was similar to that of the 2D conventional sequence (9.13% versus 9.09%, respectively, $P = 0.097$). There were no statistical differences in mean T2 values with 3D MUST-T2 among basal, mid-ventricular and apical slices for all subjects ($P = 0.655$).

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The effect of heart rate differences across healthy subjects on T2 values is shown in Figure 2d. T2 measurements obtained from 3D MUST-T2 in vivo showed no significant correlation with heart rate ($T2 = 0.026 \times \text{heart rate} + 49 \text{ ms}$, $P = 0.919$).

Eight short-axis slices of the left ventricular myocardium for one representative healthy subject obtained with the proposed 3D MUST-T2 approach are shown in Figure 6. The reconstructed T2w images and the corresponding T2 maps are included. Good visual image quality (i.e. no significant artifact and minimal to no blurring) can be observed on the native T2w images for the entire left ventricle and surrounding structures (e.g. papillary muscles). No noticeable residual undersampling artifacts were observed on the native T2w images, and corresponding T2 maps, for the entire left ventricle.

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Since MUST-T2 acquisitions were performed with isotropic spatial resolution and whole-heart coverage, the T2 maps can be reformatted in any arbitrary plane. This advantage is best appreciated in Figure 7, where reformats in multiple standard orientations (short-axis, vertical long-axis, three-chamber and four-chamber) are shown for a healthy subject.

The need for using 2D iNAVs to correct for respiratory motion is shown in Supporting Information Figure S8, where the T2 maps of two healthy subjects are shown with and without 2D translational motion correction. Motion corrected T2 maps result in sharper images better visualization of the myocardium as compared to the non-motion-corrected T2 maps, which show some spatial blurring.

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Patients

No cardiac findings were observed in the patient study. The acquisition times of the proposed 3D MUST-T2 sequence were 7 min 23 seconds (patient #1, mean heart rate: 75 bpm) and 8 min 43 seconds (patient #2, mean heart rate: 65 bpm). Figure 8 depicts the reconstructed apical, mid-cavity and basal T2 map slices, for the two patients, using the proposed 3D MUST-T2 framework compared with the current clinical reference maps (breath-held 2D T2p-SSFP). The proposed 3D MUST-T2 produces T2 maps with visual appearance comparable to the conventional 2D T2p-SSFP technique. Mean septal T2

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relaxation times were similar between the two techniques (mid-ventricular slice: patient #1: 48.2 ± 4 ms 3D MUST-T2 versus 46.3 ± 3 ms 2D T2p-SSFP, and patient #2: 51.7 ± 7 ms 3D MUST-T2 versus 50.8 ± 4 ms 2D T2p-SSFP).

DISCUSSION

In this study, we proposed a framework for highly accelerated free-breathing whole-heart T2 mapping that combines 2D translational respiratory motion correction, with a golden angle variable density spiral-like Cartesian trajectory and a recently introduced HD-PROST reconstruction. The proposed 3D MUST-T2 approach enables accurate and precise high-resolution isotropic (1.5mm^3) 3D whole-heart T2 mapping acquisitions in a fast and predictable scan time.

The performance of the proposed 3D T2 mapping framework was assessed in simulations, phantom experiments, and ten healthy subjects, while initial clinical feasibility was demonstrated in two patients with suspected cardiovascular disease.

3D MUST-T2 uses a saturation pulse to reset the magnetization immediately after the R-wave, as proposed by Ding et al. (17), and thus is mostly independent of heart rate variations. Another advantage of using saturation pulses compared to other T2 mapping techniques (3,5,16,31) is that recovery periods between subsequent heartbeats are not needed, thus reducing the total acquisition time.

Further acceleration through undersampling is crucial to achieve high isotropic resolution in a clinically feasible scan time. In phantom experiments, we observed that acceleration factors of up to 5-fold led to accurate T2 values ($R^2 > 0.99$) with respect to reference SE measurements. Besides the use of an efficient undersampling trajectory, the acquisition of low-resolution 2D iNAVs at every heartbeat also permits a substantial reduction in scan time by allowing 100% respiratory scan efficiency (no data rejection) and predictable scan time (24), as opposed to other respiratory-gated T2 mapping techniques based on dNAV acquisition (17). Other free-breathing T2 mapping techniques have been proposed to allow for 100% scan efficiency and predictable scan time. Van Heeswijk et al. (5) proposed a

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respiratory self-navigated 3D sequence to acquire isotropic 3D T2 maps with resolution of 1.7 mm^3 in a predictable scan time of $\sim 18 \text{ min}$ at 3T, while Basha et al. (32) proposed a 2D multi-slice sequence with slice tracking. The significant scan time reduction achieved with 3D MUST-T2 was exploited to acquire in vivo isotropic whole-heart Cartesian T2 maps in clinically feasible scan times ($\sim 8 \text{ min}$), while a fully sampled acquisition would have required $>35 \text{ mins}$. The total imaging time for 3D MUST-T2 being mainly affected by the subject's heart rate and the number of slices needed to cover the whole-heart in the anterior-posterior direction. For comparison, the conventional breath-hold 2D T2p-SSFP sequence would have required between 5 and 7 minutes to cover the entire heart (assuming 7 s breathing commands, 10 s resting time between acquisitions, 10 s breath-hold, and assuming that 11 to 16 slices are needed to cover the heart). The proposed 3D T2 mapping sequence can also be performed with lower anisotropic resolution (e.g., $2.0 \times 2.0 \times 6.0 \text{ mm}^3$ as achieved in (16)), that will result in shorter scan times and inherently co-registered slices due to the 3D nature of the acquisition.

The acquisition of undersampled data comes, however, at the cost of significant loss of information which needs to be recovered. Multi-contrast HD-PROST reconstruction takes advantage of the local, non-local and contrast redundancies found in the T2w images, to recover whole-heart T2 maps with negligible remaining aliasing artifacts. The measurements of myocardial T2 values by 3D MUST-T2 in healthy subjects (average septal $T2 = 50.8 \pm 3 \text{ ms}$) were in good agreement with in vivo values published in a previous study at 1.5T with centric ordering ($T2 = 50 \pm 4 \text{ ms}$ (33)). T2 overestimation with respect to the conventional breath-hold 2D T2p-SSFP sequence was observed, with a bias of $4.2 \pm 6.2 \text{ ms}$. This overestimation was likely due to the choice of centric (3D MUST-T2) versus linear (2D T2p-SSFP) k-space ordering, as observed by Giri et al. (3). Other confounding factors such as heart rate variations (34), not present in the phantom study, or the use of fat saturation and adiabatic T2 preparation pulses could also explain this overestimation in vivo and will be further explored.

Although high acceleration factors were reached with the proposed 3D sequence, precision of T2 values in vivo did not show significant deviations from the conventional 2D T2p-

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SSFP acquisitions (4.6 ± 1 ms vs. 4.3 ± 2 ms, $P = 0.520$), and were similar to previously reported values at 3T (5,17). This can be attributed to the good performance of HD-PROST reconstruction in concert with the VD-CASPR trajectory, which limits the propagation of noise in the T2w images, noise being a severe side effect of saturation-based MR mapping techniques (16,35,36).

Dictionary-based matching was used in this study to accurately estimate myocardial T2 values by pre-generating a dictionary representative of the proposed T2 mapping sequence, and whose elements are composed of simulated signal evolution curves (28). Our findings in phantom experiments showed that dictionary-based matching has the potential to accurately estimate myocardial T2 values acquired with both 3D MUST-T2 and conventional T2p-bSSFP, whereas a T2 bias was observed with conventional mono-exponential fitting for both methods (Supporting Information Figure S4). This can be partly explained by the fact that mono-exponential fitting does not accurately describe the acquisition parameters and the signal evolution during acquisition, such as bSSFP T1/T2 ratio of tissue, subject-specific heart-rate, number of segments per heartbeat, and number of linear ramp-up pulses. Therefore, the use of dictionary-based matching could also improve conventional 2D T2p-SSFP and potentially reduce the bias observed with linear phase encoding.

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A limitation of the current framework is that only 2D translation respiratory motion correction was performed to ensure fast reconstruction times. It has been shown in previous reports that non-rigid motion registration can improve reproducibility and spatial variability of 2D T2 mapping techniques (8,11). While this issue was not shown to be significant in the present experiments, it can be overcome by incorporating 3D non-rigid respiratory motion correction directly in the image reconstruction (37–39). Another alternative to deal with large motion between the T2w images is to extend the proposed HD-PROST reconstruction to enable motion-resolved reconstruction by extending the searching neighborhood for patch selection to the spatial-temporal dimension (40).

In this study, mid-diastolic imaging was employed to minimize cardiac motion and guarantee long saturation times. However, in subjects with highly variable heart rates or high heart rates, end-systolic imaging may be preferred. Future studies will investigate the effect of shorter saturation times on the accuracy and precision of saturation-based T2 mapping, however our phantom experiments demonstrate that accuracy is not affected for different heart rates between 50 and 100 bpm.

Moreover, incomplete saturation of fat signal can occur in some regions of the T2w images, especially around the epicardial fat area. This effect can lead to fat-myocardium partial volume effect, apparent distortion and loss of sharpness on the T2 map and may alter the T2 measurements. Further optimized fat suppression for each T2w image will be investigated in the future to alleviate this difficulty.

Translational motion estimation and correction was performed inline in the scanner software while HD-PROST reconstruction and dictionary matching were performed offline. The efficient multithreaded implementation of HD-PROST allowed for fast T2 map reconstruction (in the order of 3 minutes). Further speedup, to reach sub-minute runtime, could be achieved by implementing the reconstruction on multiple GPUs and using coil compression strategies (41).

It should be noted that 3D MUST-T2 is based on a T2-prepared sequence commonly used in coronary MR angiography (42). The acceptable contrast provided by the last T2w volume ($TE_{T2prep} = 55$ ms, Figures 6 and 7) could also be exploited to visualize whole heart cardiac and proximal coronary artery anatomy. Thus, 3D MUST-T2 may be used for the simultaneous assessment of cardiac and coronary anatomy and myocardial T2 relaxation times in a highly simplified and efficient single free-breathing acquisition. This additional gain could potentially benefit patients with acute non-ST-segment elevation myocardial infarction where obstructive coronary artery disease and myocardial edema are often characteristic (13).

The proposed free-breathing T2 mapping framework could benefit many cardiovascular patients with severe shortness of breath and where imaging under breath-holding is often

challenging. Preliminary insights into the potential of the proposed 3D MUST-T2 mapping technique in a clinical setting was provided for two patients with suspected cardiovascular disease. While no pathologies were observed in this proof-of-concept study, scanning patients often leads to new challenges (e.g., variable heart rate, irregular breathing pattern, poor compliance), resulting in degraded image quality. Higher amplitude in respiratory motion of the heart, as provided by the 2D iNAVs, was observed in patients compared to healthy controls (Supporting Information Figure S9). Mean septal T2 values measured on the two patients were comparable to that of the healthy subjects. Besides T2 relaxation times conform to the literature (Figure 8), the 3D whole-heart isotropic coverage of the proposed technique offers the opportunity to reformat the T2 maps in any desired orientation, which can be particularly useful for the comprehensive assessment of pathological tissues with complex geometry (6).

Commented [BA8]: R3.3

The proposed framework also shares similarities with the recent qBOOST-T2 approach (43) that enables co-registered bright-blood and black-blood whole-heart imaging, together with T2 quantification and coronary lumen visualization, through the use of an inversion pulse every three heartbeats. While the latest technique may be preferred whenever coronary assessment or pre-contrast black-blood images are clinically required, a thorough comparison of the two approaches in large patient cohorts will need to be studied.

Finally, the proposed fast and efficient framework holds promise for wider cardiac applications such as high-resolution motion compensated 3D T1 mapping and 3D joint T1-T2 mapping (44–49); both of which will be investigated in future works.

CONCLUSION

A novel approach was developed to enable free-breathing whole-heart 3D T2 mapping with high isotropic spatial resolution (1.5mm³) in a clinically feasible scan time (<8 min with 100% scan efficiency and predictable scan time). The proposed 3D MUST-T2 framework achieved accurate T2 quantification in phantom, and in vivo with fast acquisition and good map quality in vivo. 3D-MUST T2 mapping may have potential to aid the management of many cardiomyopathies in which fast and efficient free-breathing acquisitions are key to

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patient comfort, while high isotropic resolution is crucial to accurately map tissue heterogeneity. Further studies to assess the clinical utility of 3D MUST-T2 mapping in patients with myocardial inflammation are now warranted.

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Figure Captions

Figure 1 Schematic overview of the proposed free-breathing 3D MUST-T2 technique for whole-heart myocardial T2 mapping. Three T2-prepared volumes are acquired sequentially with increasing TE_{T2prep} ([0,28,55] ms). A nonselective saturation pulse is applied immediately after the ECG R-wave to avoid recovery heartbeats. A 2D image-navigator is acquired to enable translational respiratory motion correction of the heart and shorter and predictable scan times. A golden-angle shifted variable density Cartesian undersampling is employed to achieve clinically feasible scan times. All T2 prepared volumes are reconstructed simultaneously with HD-PROST (18). A dictionary is then simulated and matched to the measured signal to generate the whole-heart T2 maps. Abbreviations: TD, trigger delay; T_{SAT} , saturation time; AW, acquisition window

Figure 2 Results from EPG simulations show the effect of the saturation pulse on the MR signal evolution. (A) shows the simulated magnetization obtained with the EPG formalism for different recovery times (ranging from 0 to 9 seconds) when the saturation pulse is not used. The signals were generated for tissues with a T2 of 50 ms, varying T1s (ranging from 700 ms to 1200 ms), $TE_{T2prep} = 50$ ms, and a simulated heart rate of 60 bpm. For long T1s, a minimum of ~6 idle heartbeats are needed to allow for full recovery of the longitudinal magnetization. When the saturation pulse is applied at every heartbeat (B), idle heartbeats are not required for signal recovery, at the cost of lower signal intensity. (C) Evolution of the matched T2 values obtained with the proposed 3D MUST-T2 mapping sequence over different simulated heart rates (ranging from 50 bpm to 100 bpm) for each phantom vial. The proposed approach is mostly insensitive to heart rate variations, even for long T1s. (D) The effect of different heart rates across all healthy subjects (N = 10) on mean T2 values is shown.

Figure 3 Phantom accuracy for the proposed 3D MUST-T2 sequence. Plots are comparing the mean T2 values derived from the nine vials for five different acceleration factors with the ground truth T2 values (measured by SE with eight TEs from 10-640 ms (29)), conventional 2D T2p-SSFP mapping (green) and the proposed 3D MUST-T2 sequence. T2

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accuracy is preserved with the proposed approach with excellent agreement with the reference T2 values, even for high acceleration (x5). T2 values for the last tube (T2 = 250ms) were out of range (>300 ms) for the 2D T2p-SSFP sequence and therefore are not shown.

Figure 4 T2 maps obtained using the proposed free-breathing 3D MUST-T2 sequence and the conventional breath-held 2D T2p-SSFP sequence are shown for three healthy subjects. 3D MUST-T2 slices were reformatted to short-axis to match the 2D T2 map acquisitions.

~~High visual image quality and sharpness can be observed on the 3D MUST-T2 maps with clear delineation~~ Good visualization of the myocardium and surrounding structures can be observed on the 3D MUST-T2 maps. Acquisition times are expressed as [min:sec].

Commented [BA10]: R2.1

Abbreviations: BPM, beats per minute; AT, acquisition time

Figure 5 Accuracy and precision of the proposed 3D MUST-T2 mapping sequence. (A) T2 accuracy of the proposed 3D MUST-T2 sequence versus conventional 2D T2p-SSFP, as measured by the mean T2 value are shown in the left ventricular segmentation. T2 values are in good agreement with the literature ($T2 = 50 \pm 4$ ms (33)). The averaged T2 relaxation times over the whole myocardium are shown in the bull's eye plots' center. Accuracy (B) and precision (C) of T2 relaxation times (ms) obtained in the myocardial septum with the proposed 3D MUST-T2 and the conventional 2D T2p-SSFP are shown for the 10 healthy subjects.

Figure 6 Three-dimensional visualization of the acquired T2w images and the corresponding T2 volume. Representative T2w images for subject 2 (acquisition time: 10 min, heart rate = 38 bpm), and the corresponding T2 maps obtained by the proposed 3D MUST-T2. Eight reformatted short-axis slices that cover the heart from apex to base are shown. Uniform distribution of T2 values through the slices over the whole-left ventricle can be observed. The color scale indicates T2 values between 0-120 ms.

Figure 7 Representative T2-prepared images for subject 2 and the corresponding T2 maps obtained with the proposed 3D MUST-T2 sequence. Reformats in short-axis, vertical long-axis, 3-chamber and 4-chamber views are shown.

Figure 8 Short-axis T2 maps at apical, mid-ventricular and basal level for two patients acquired with the proposed free-breathing 3D MUST-T2 framework and the conventional breath-hold 2D T2p-SSFP sequence. The septal T2 relaxation times for each slice are reported as mean \pm standard deviation.

Supporting Information Figure Captions

Additional Supporting Information may be found in the online version of this article.

Supporting Information Figure S1 A 3D Cartesian variable-density trajectory was employed to allow for fast acquisition of multiple T2w images. The Cartesian trajectory with spiral order samples the k_y - k_z phase encoding plane following approximate spiral interleaves on the Cartesian grid with variable density along each spiral arm. In this sketch, the 2 first acquired spirals are shown for each contrast, each spiral containing 20 segments. A golden angle rotation between successive spirals and successive contrasts is applied to introduce incoherently distributed aliasing artifacts along the contrast dimension, and noise-like artifacts in the spatial dimension.

Supporting Information Figure S2 Flowchart of the optimization 2 of the proposed High-Dimensionality Patch-based RecOnSTruction (HD-PROST). Denoising of multiple T2w images is performed using a 3D block matching, which groups and unfolds similar 3D patches in the noisy multi-contrast images to form a low-rank 2D matrix. A third-order tensor is formed by stacking the T2 contrast dimension on the third dimension. The high-order tensor of size N (number of pixels in each patch) \times K (number of similar patches within a neighborhood) \times L (number of T2 contrasts) admits a low multilinear rank approximation and can be compressed, through high-order tensor decomposition, by truncating the multilinear singular vectors that correspond to small multilinear singular values. The outputs of this step are the denoised multi-contrast images which are then used in the joint regularized reconstruction step (optimization 1) as prior knowledge. Reconstruction parameters used in this study are shown (bottom row). We refer the reader to (18) for more information on these parameters. Reconstruction parameter details: N ,

patch size (in pixels); L , number of contrasts; K , number of similar patches; λ_p , threshold value.

Supporting Information Figure S3 Simulations of the proposed T2 mapping sequence were performed using the EPG formalism to assess the effect of T1 in the EPG-based dictionary on the matched T2 value. Signals evolutions for different T1 (from 850 to 1200 with a step size of 50 ms) and T2 (from 42 to 82 with a step size of 8 ms) were generated and matched to a dictionary simulated with fixed T1 (1100 ms) and varying T2s (similar to the one used in the phantom experiment). (A) Matched T2 is plotted as a function of T1. (B) The signal evolutions corresponding to short ($T1/T2 = 800/52$ ms), medium ($T1/T2 = 1100/52$ ms), and long ($T1/T2 = 1300/52$ ms) T1 myocardium were generated for the proposed sequence through EPG simulation. The obtained signal evolutions did not seem to differ, suggesting that the proposed 3D MUST-T2 map sequence with dictionary-based matching is independent of the T1 used in the EPG-based dictionary (matched T2s were the same for the three generated signals and equal to 52 ms). Therefore, for the phantom and in vivo experiments, we kept the T1 constant at 1100 ms.

Supporting Information Figure S4 Conventional mono-exponential fitting and dictionary-based matching for 2D T2p-SSFP T2 mapping in comparison to the proposed 3D MUST-T2 sequence for the phantom study. The proposed 3D acquisition with mono-exponential fitting is also included for comparison purposes. Accurate phantom T2 values, in agreement with reference spin echo, were obtained with the proposed 3D MUST-T2 sequence with dictionary-based matching, however bias is observed with the proposed acquisition when mono-exponential fitting is employed. Bias is also observed with the conventional (linear phase encoding) 2D T2p-SSFP mapping with mono-exponential fitting, however this bias is significantly reduced when dictionary-based matching is employed.

Supporting Information Figure S5 Spatial T2 uniformity over the slice direction is assessed for the phantom study for three vials (corresponding to short, medium and long T1 myocardium). The solid line is the average difference between gold-standard spin echo

and the proposed 3D MUST-T2 mapping sequence, and the dashed lines represent the mean \pm two standard deviations between the two techniques. Good T2 uniformity can be observed with the proposed technique. The mean difference in T2 for the vial corresponding to short T1 myocardium was -0.6 ms [$\pm 95\%$ confidence interval (CI) = -2.1/0.89 ms), -0.6 ms [$\pm 95\%$ CI = -3.7/2.5 ms) for the medium T1 myocardium, and -1.4 ms [$\pm 95\%$ CI = -4.9/2.0 ms) for the long T1 myocardium.

Supporting Information Figure S6 T2 maps obtained using the proposed free-breathing 3D MUST-T2 mapping sequence and the conventional breath-held 2D T2p-SSFP sequence are shown for three additional healthy subjects. 3D MUST-T2 slices were reformatted to short-axis to match the 2D T2 map acquisitions. Representative 16 AHA segments are shown to illustrate how much spatial information was considered for T2 calculation. Acquisition times are expressed as [min:sec]. Abbreviations: BPM, beats per minute; AT, acquisition time.

Supporting Information Figure S7 Axial view of T2 maps acquired using the proposed 3D T2 mapping sequence on 3 healthy subjects. Number of slices was adjusted per subject to cover the left ventricle in the anterior-posterior direction.

Supporting Information Figure S8 Impact of iNAV-based beat-to-beat translation motion correction on 3D MUST-T2 map is shown for two healthy subjects. Reconstructed T2w images ($TE_{T2prep} = 55$ ms) are shown before and after motion correction with the corresponding T2 maps (A). ~~Increased image sharpness~~ Better visualization of the myocardium can be observed after motion correction with clear delineation of cardiac structures and myocardial walls. Note the blurring observed on the non-motion corrected T2 maps. Plots showing the intensity profiles, taken on the T2w images through the heart-liver interface, are shown in (B). ~~Increase sharpness can be observed when translational respiratory motion correction is applied (indicated by the green lines).~~

Commented [BA11]: R2.1

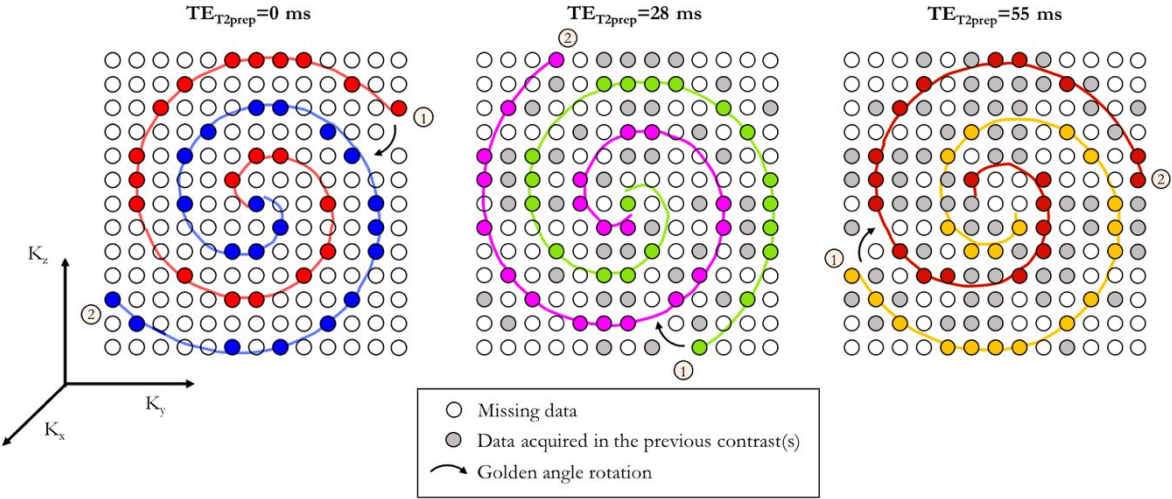
Supporting Information Figure S9 (A) Foot-head respiratory displacements of the heart obtained from the 2D image navigators at each heartbeat are shown for 2 representative healthy subjects (left) and 2 patients (right). The end-expiration position is used as reference

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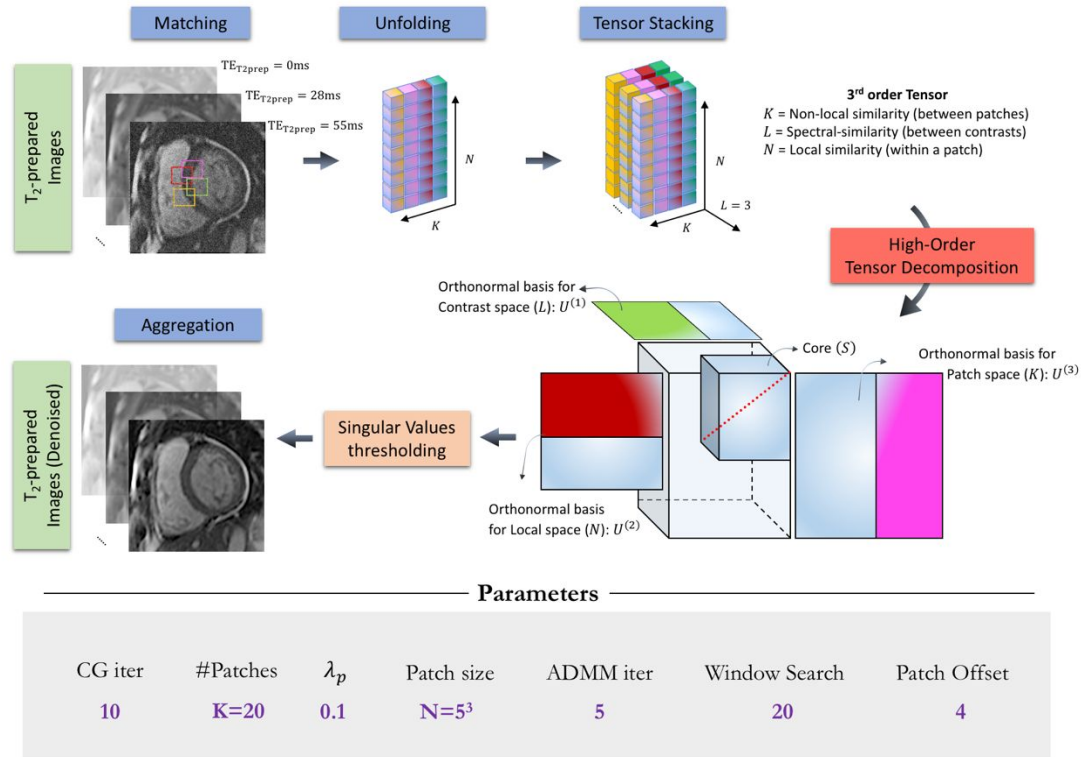
for translational motion estimation. While regular breathing patterns can be observed on the healthy subjects, more irregular breathing patterns with strong motion amplitudes are observed on patient 1 and patient 2. (B) Average R-R intervals are shown for each healthy subject and patient. Patient 1 presented with irregular cardiac rhythm ($R-R = 838 \pm 211$ ms).

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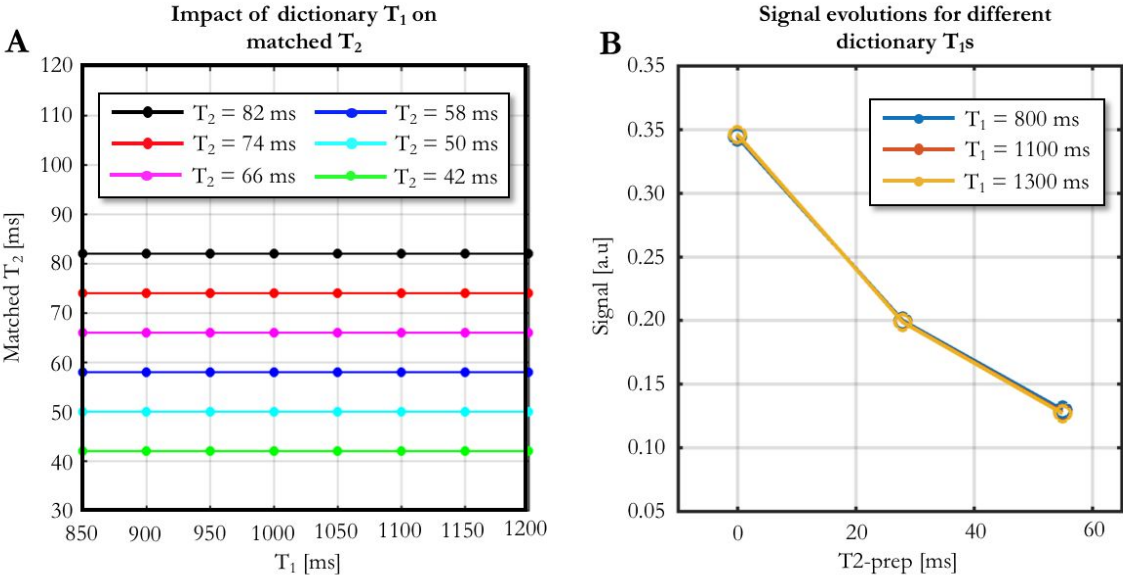
For Peer Review



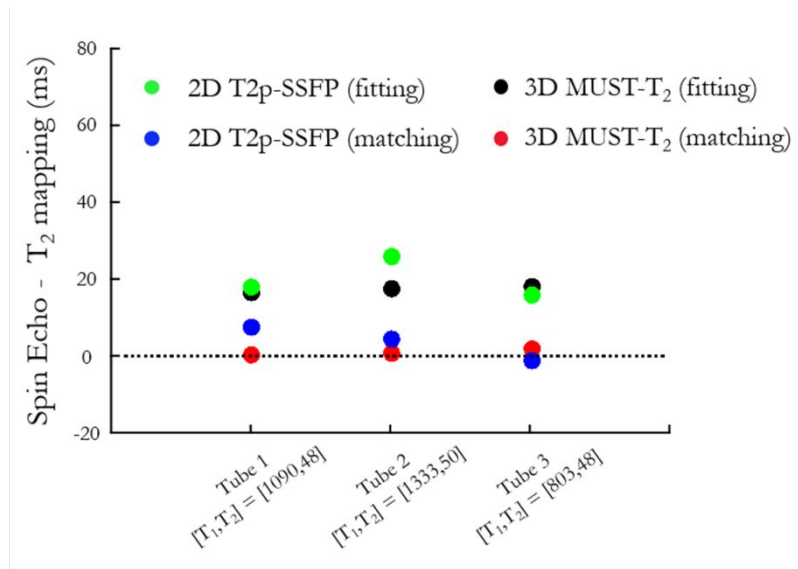
Supporting Information Figure S1 A 3D Cartesian variable-density trajectory was employed to allow for fast acquisition of multiple T2w images. The Cartesian trajectory with spiral order samples the k_y - k_z phase encoding plane following approximate spiral interleaves on the Cartesian grid with variable density along each spiral arm. In this sketch, the 2 first acquired spirals are shown for each contrast, each spiral containing 20 segments. A golden angle rotation between successive spirals and successive contrasts is applied to introduce incoherently distributed aliasing artifacts along the contrast dimension, and noise-like artifacts in the spatial dimension.



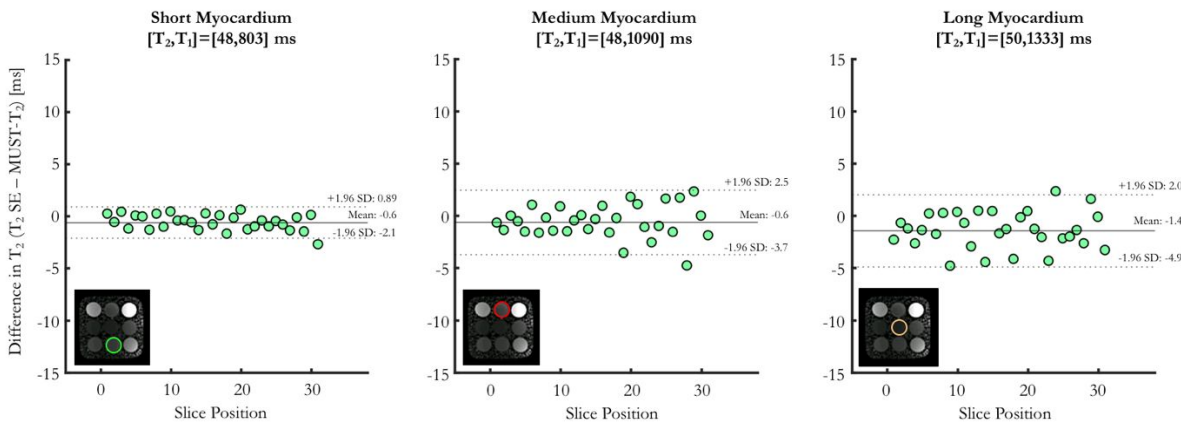
Supporting Information Figure S2 Flowchart of the optimization 2 of the proposed High-Dimensionality Patch-based RecOnSTruction (HD-PROST). Denoising of multiple T2w images is performed using a 3D block matching, which groups and unfolds similar 3D patches in the noisy multi-contrast images to form a low-rank 2D matrix. A third-order tensor is formed by stacking the T2 contrast dimension on the third dimension. The high-order tensor of size N (number of pixels in each patch) \times K (number of similar patches within a neighborhood) \times L (number of T2 contrasts) admits a low multilinear rank approximation and can be compressed, through high-order tensor decomposition, by truncating the multilinear singular vectors that correspond to small multilinear singular values. The outputs of this step are the denoised multi-contrast images which are then used in the joint regularized reconstruction step (optimization 1) as prior knowledge. Reconstruction parameters used in this study are shown (bottom row). We refer the reader to (18) for more information on these parameters. Reconstruction parameter details: N , patch size (in pixels); L , number of contrasts; K , number of similar patches; λ_p , threshold value.



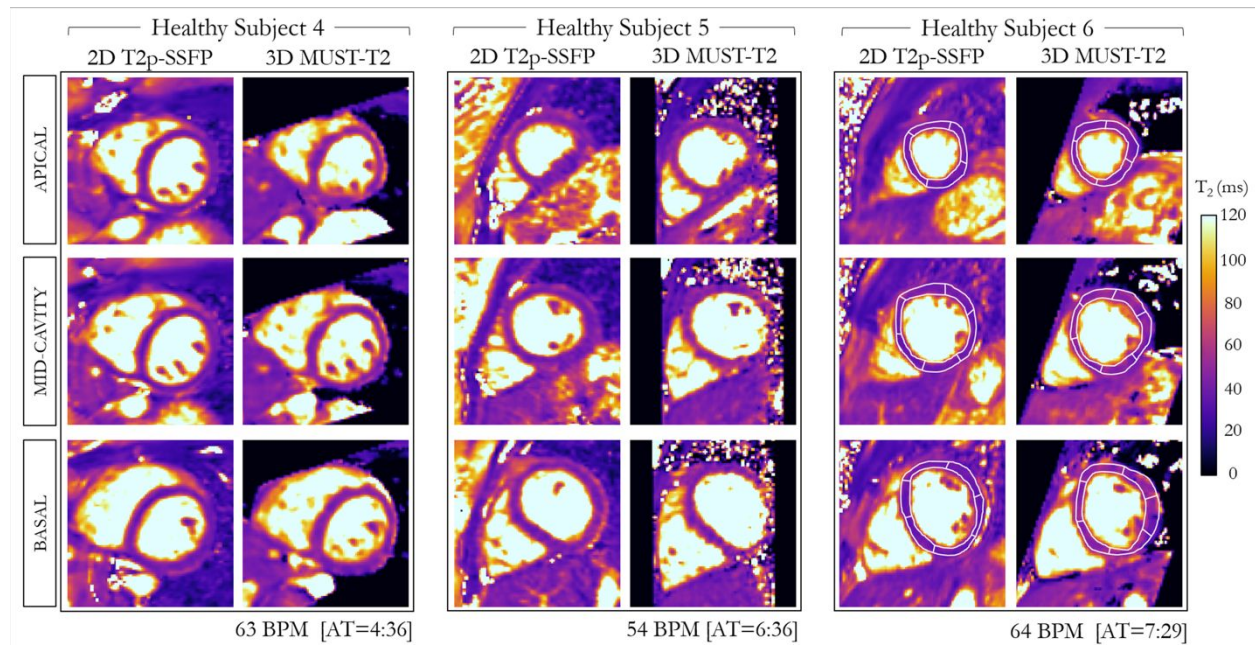
Supporting Information Figure S3 Simulations of the proposed T_2 mapping sequence were performed using the EPG formalism to assess the effect of T_1 in the EPG-based dictionary on the matched T_2 value. Signals evolutions for different T_1 (from 850 to 1200 with a step size of 50 ms) and T_2 (from 42 to 82 with a step size of 8 ms) were generated and matched to a dictionary simulated with fixed T_1 (1100 ms) and varying T_2 s (similar to the one used in the phantom experiment). (A) Matched T_2 is plotted as a function of T_1 . (B) The signal evolutions corresponding to short ($T_1/T_2 = 800/52$ ms), medium ($T_1/T_2 = 1100/52$ ms), and long ($T_1/T_2 = 1300/52$ ms) T_1 myocardium were generated for the proposed sequence through EPG simulation. The obtained signal evolutions did not seem to differ, suggesting that the proposed 3D MUST- T_2 map sequence with dictionary-based matching is independent of the T_1 used in the EPG-based dictionary (matched T_2 s were the same for the three generated signals and equal to 52 ms). Therefore, for the phantom and in vivo experiments, we kept the T_1 constant at 1100 ms.



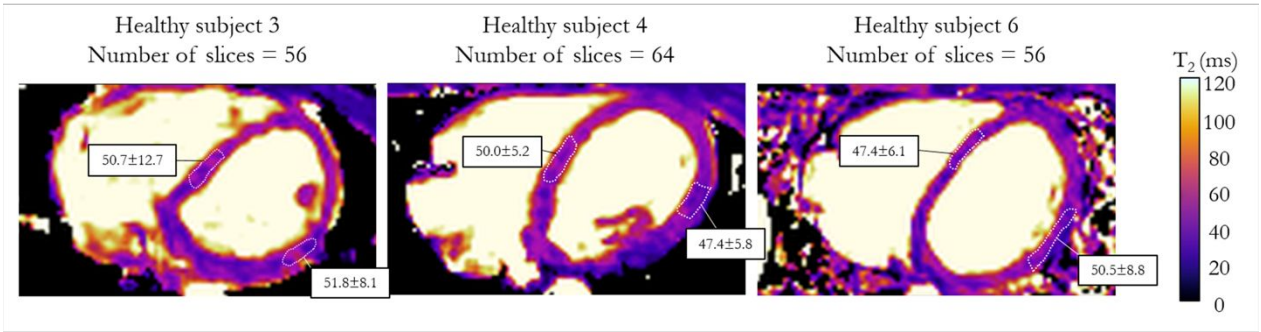
Supporting Information Figure S4 Conventional mono-exponential fitting and dictionary-based matching for 2D T2p-SSFP T2 mapping in comparison to the proposed 3D MUST-T2 sequence for the phantom study. The proposed 3D acquisition with mono-exponential fitting is also included for comparison purposes. Accurate phantom T2 values, in agreement with reference spin echo, were obtained with the proposed 3D MUST-T2 sequence with dictionary-based matching, however bias is observed with the proposed acquisition when mono-exponential fitting is employed. Bias is also observed with the conventional (linear phase encoding) 2D T2p-SSFP mapping with mono-exponential fitting, however this bias is significantly reduced when dictionary-based matching is employed.



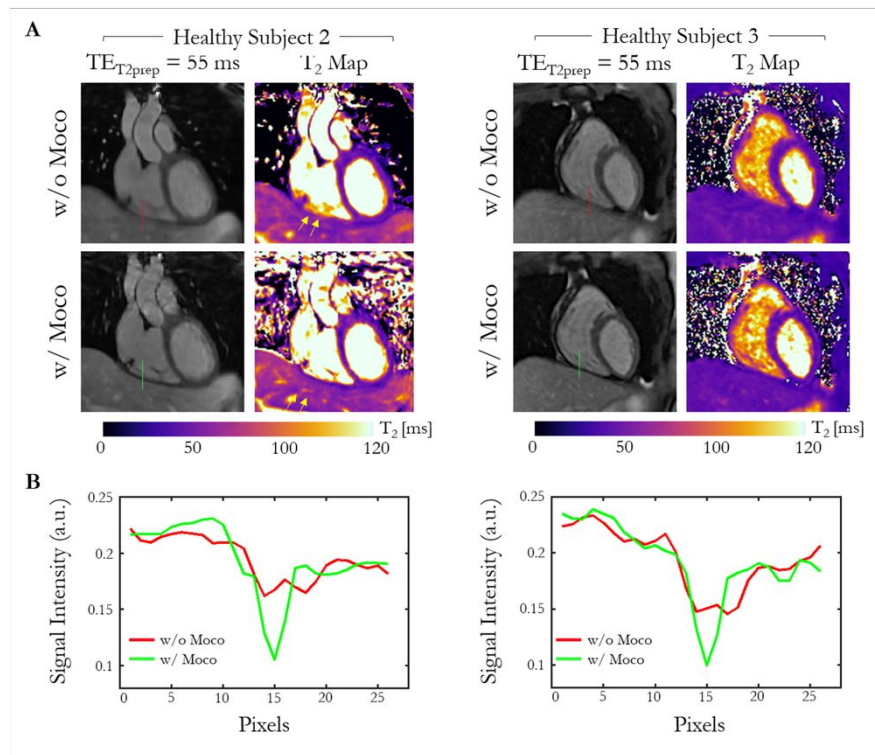
Supporting Information Figure S5 Spatial T2 uniformity over the slice direction is assessed for the phantom study for three vials (corresponding to short, medium and long T1 myocardium). The solid line is the average difference between gold-standard spin echo and the proposed 3D MUST-T2 mapping sequence, and the dashed lines represent the mean \pm two standard deviations between the two techniques. Good T2 uniformity can be observed with the proposed technique. The mean difference in T2 for the vial corresponding to short T1 myocardium was -0.6 ms [\pm 95% confidence interval (CI) = -2.1/0.89 ms), -0.6 ms [\pm 95% CI = -3.7/2.5 ms) for the medium T1 myocardium, and -1.4 ms [\pm 95% CI = -4.9/2.0 ms) for the long T1 myocardium.



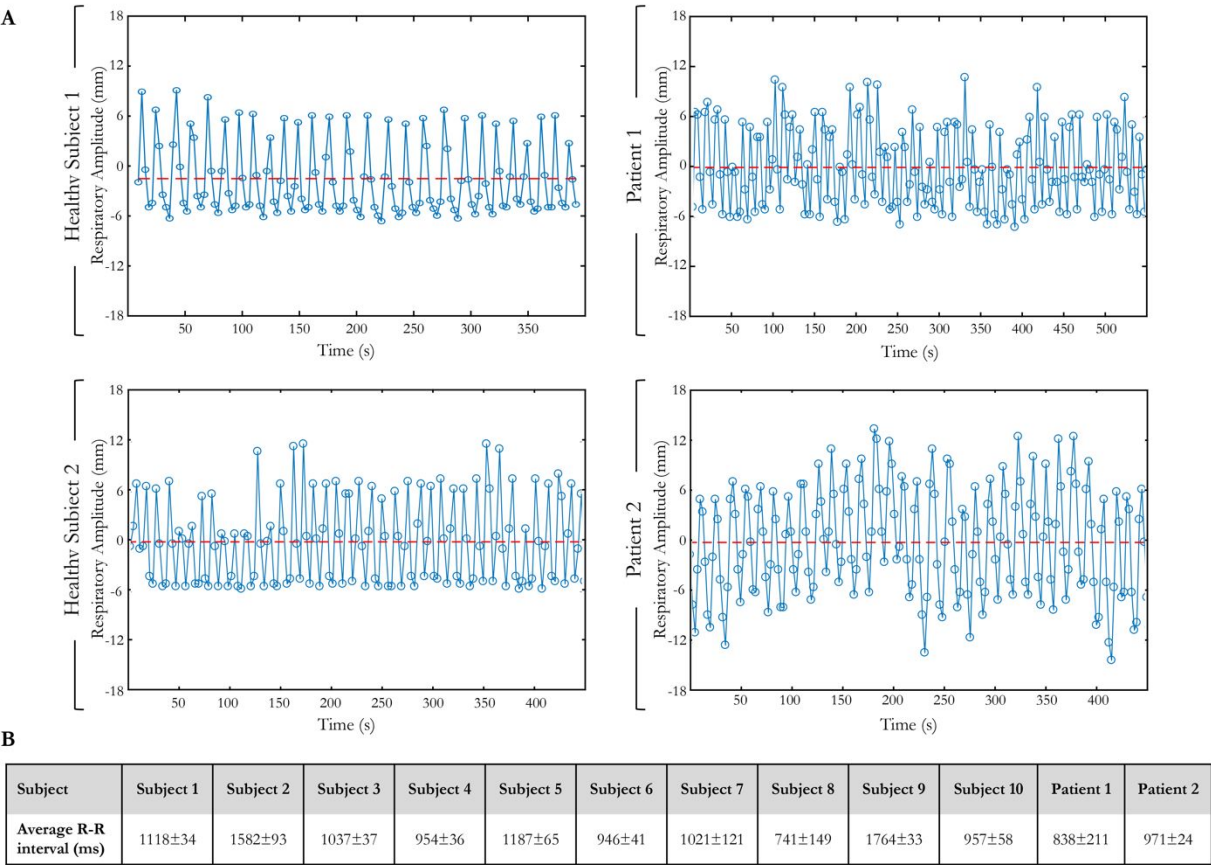
Supporting Information Figure S6 T2 maps obtained using the proposed free-breathing 3D MUST-T2 mapping sequence and the conventional breath-held 2D T2p-SSFP sequence are shown for three additional healthy subjects. 3D MUST-T2 slices were reformatted to short-axis to match the 2D T2 map acquisitions. Representative 16 AHA segments are shown to illustrate how much spatial information was considered for T2 calculation. Acquisition times are expressed as [min:sec]. Abbreviations: BPM, beats per minute; AT, acquisition time.



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Supporting Information Figure S8 Impact of iNAV-based beat-to-beat translation motion correction on 3D MUST-T2 map is shown for two healthy subjects. Reconstructed T2w images ($TE_{T2prep} = 55$ ms) are shown before and after motion correction with the corresponding T2 maps (A). Better visualization of the myocardium can be observed after motion correction with clear delineation of cardiac structures and myocardial walls. Note the blurring observed on the non-motion corrected T2 maps. Plots showing the intensity profiles, taken on the T2w images through the heart-liver interface, are shown in (B).



Supporting Information Figure S9 (A) Foot-head respiratory displacements of the heart obtained from the 2D image navigators at each heartbeat are shown for 2 representative healthy subjects (left) and 2 patients (right). The end-expiratory position is used as reference for translational motion estimation. While regular breathing patterns can be observed on the healthy subjects, more irregular breathing patterns with strong motion amplitudes are observed on patient 1 and patient 2. **(B)** Average R-R intervals are shown for each healthy subject and patient. Patient 1 presented with irregular cardiac rhythm (R-R = 838±211 ms).

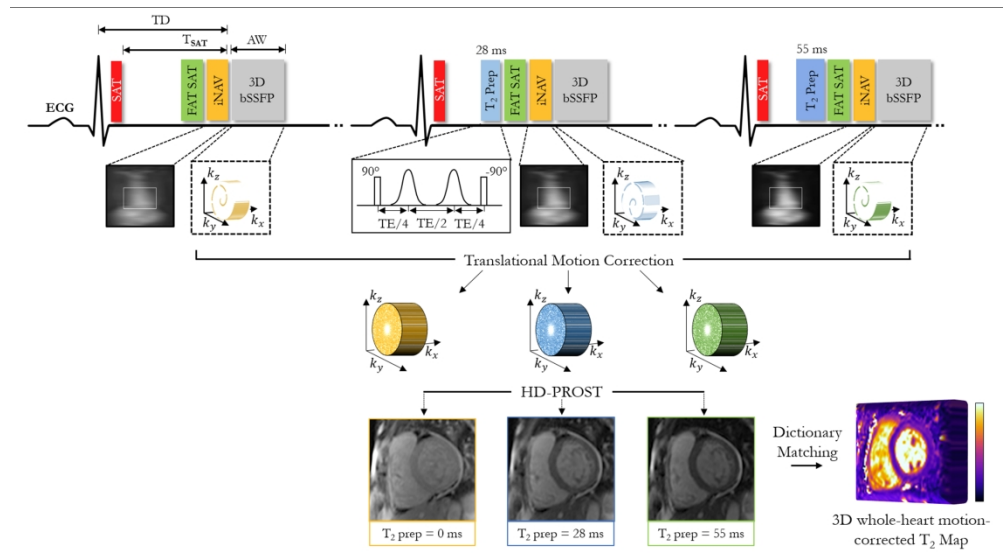


Figure 1. Schematic overview of the proposed free-breathing 3D MUST-T2 technique for whole-heart myocardial T2 mapping. Three T2-prepared volumes are acquired sequentially with increasing $TE_{T2\text{prep}}$ ([0,28,55] ms). A nonselective saturation pulse is applied immediately after the ECG R-wave to avoid recovery heartbeats. A 2D image-navigator is acquired to enable translational respiratory motion correction of the heart and shorter and predictable scan times. A golden-angle shifted variable density Cartesian undersampling is employed to achieve clinically feasible scan times. All T2 prepared volumes are reconstructed simultaneously with HD-PROST (18). A dictionary is then simulated and matched to the measured signal to generate the whole-heart T2 maps. Abbreviations: TD, trigger delay; T_{SAT} , saturation time; AW, acquisition window.

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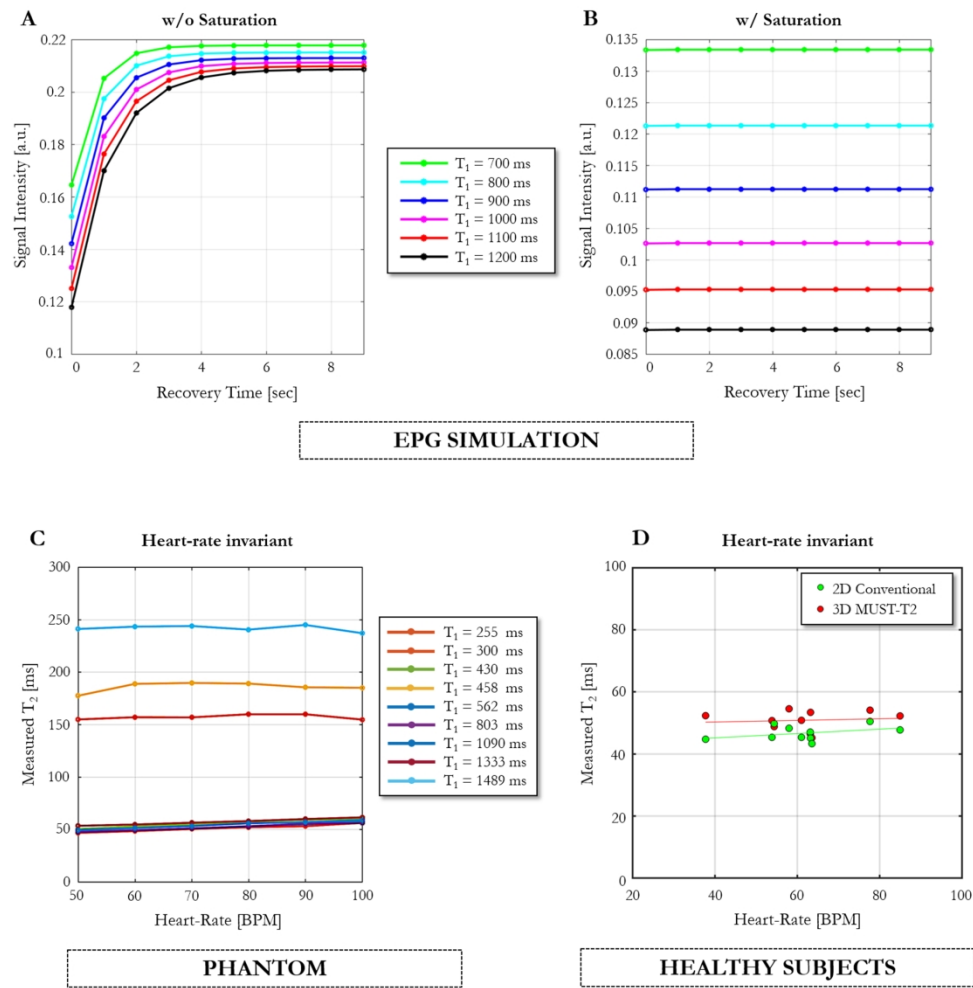


Figure 2. Results from EPG simulations show the effect of the saturation pulse on the MR signal evolution.

(A) shows the simulated magnetization obtained with the EPG formalism for different recovery times (ranging from 0 to 9 seconds) when the saturation pulse is not used. The signals were generated for tissues with a T₂ of 50 ms, varying T₁s (ranging from 700 ms to 1200 ms), TE_{T₂prep} = 50 ms, and a simulated heart-rate of 60 bpm. For long T₁s, a minimum of ~6 idle heartbeats are needed to allow for full recovery of the longitudinal magnetization. When the saturation pulse is applied at every heart-beat (B), idle heartbeats are not required for signal recovery, at the cost of lower signal intensity. (C) Evolution of the matched T₂ values obtained with the proposed 3D MUST-T₂ mapping sequence over different simulated heart-rates (ranging from 50 bpm to 100 bpm) for each phantom vial. The proposed approach is mostly insensitive to heart-rate variations, even for long T₁s. (D) The effect of different heart-rates across all healthy subjects (N = 10) on mean T₂ values is shown.

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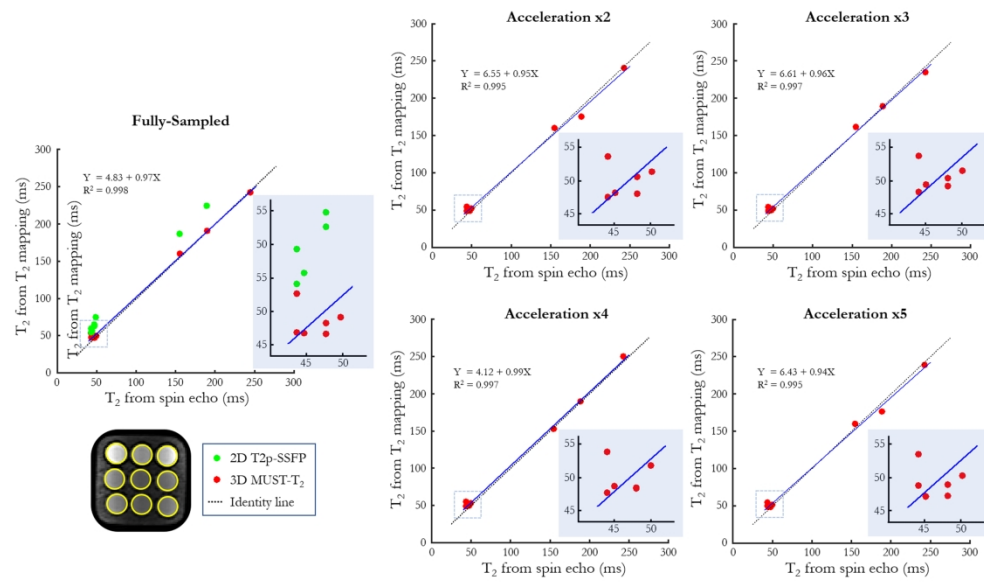


Figure 3. Phantom accuracy for the proposed 3D MUST-T2 sequence. Plots are comparing the mean T2 values derived from the nine vials for five different acceleration factors with the ground truth T2 values (measured by SE with eight TEs from 10-640 ms [29]), conventional 2D T2p-SSFP mapping (green) and the proposed 3D MUST-T2 sequence. T2 accuracy is preserved with the proposed approach with excellent agreement with the reference T2 values, even for high acceleration (x5). T2 values for the last tube (T2 = 250ms) were out of range (>300 ms) for the 2D T2p-SSFP sequence and therefore are not shown.

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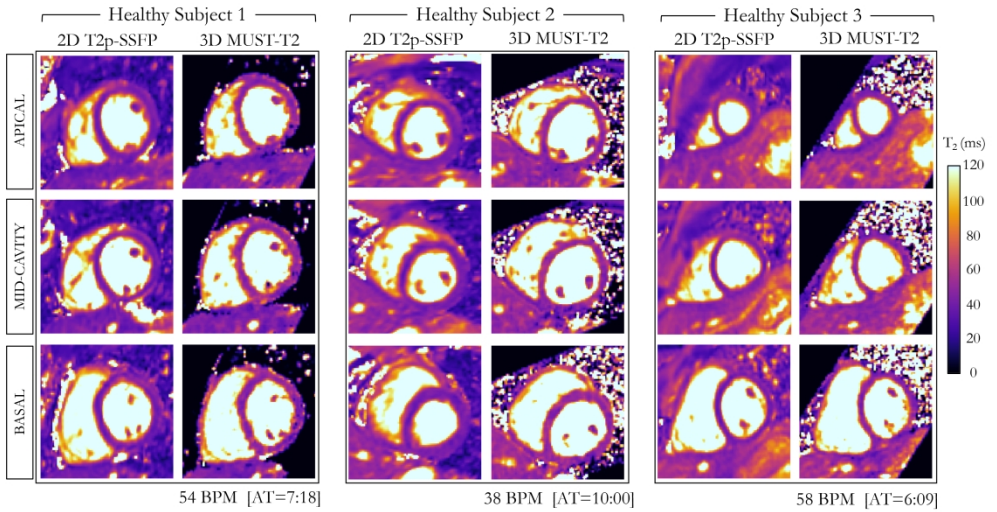


Figure 4. T2 maps obtained using the proposed free-breathing 3D MUST-T2 sequence and the conventional breath-held 2D T2p-SSFP sequence are shown for three healthy subjects. 3D MUST-T2 slices were reformatted to short-axis to match the 2D T2 map acquisitions. Good visualization of the myocardium and surrounding structures can be observed on the 3D MUST-T2 maps. Acquisition times are expressed as [min:sec]. Abbreviations: BPM, beats per minute; AT, acquisition time.

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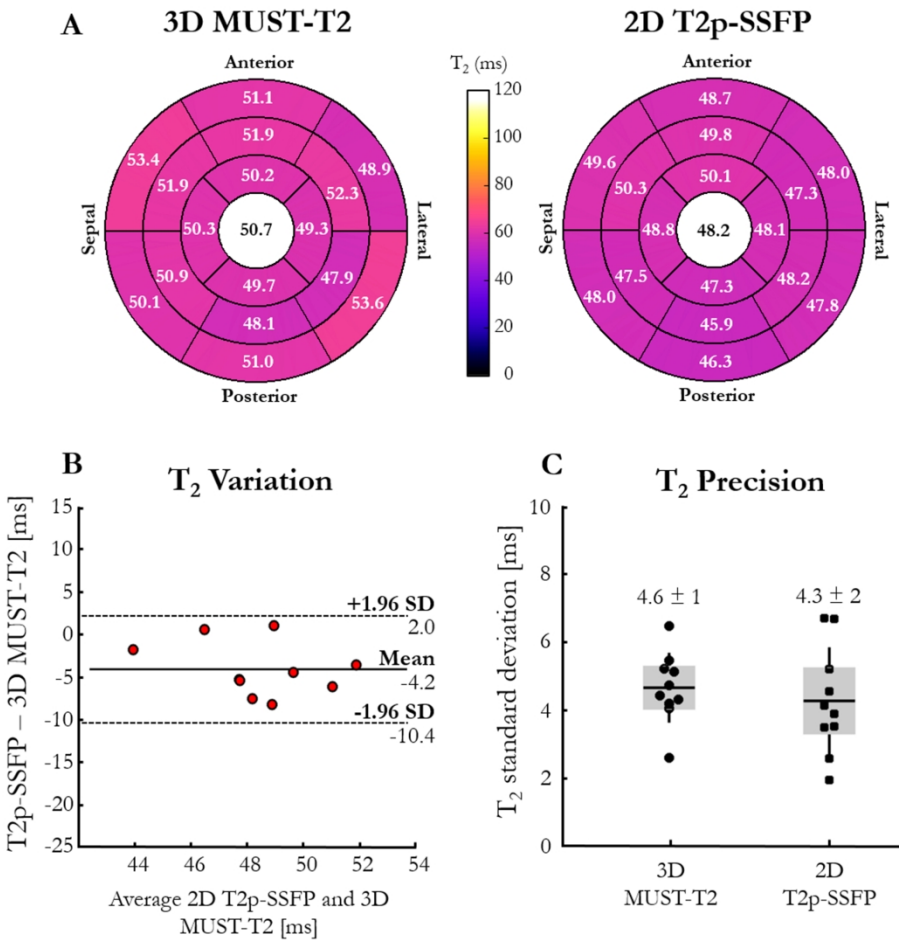


Figure 5. Accuracy and precision of the proposed 3D MUST-T2 mapping sequence. (A) T2 accuracy of the proposed 3D MUST-T2 sequence versus conventional 2D T2p-SSFP, as measured by the mean T2 value are shown in the left ventricular segmentation. T2 values are in good agreement with the literature ($T_2 = 50 \pm 4$ ms (33)). The averaged T2 relaxation times over the whole myocardium are shown in the bull's eye plots' center. Accuracy (B) and precision (C) of T2 relaxation times (ms) obtained in the myocardial septum with the proposed 3D MUST-T2 and the conventional 2D T2p-SSFP are shown for the 10 healthy subjects.

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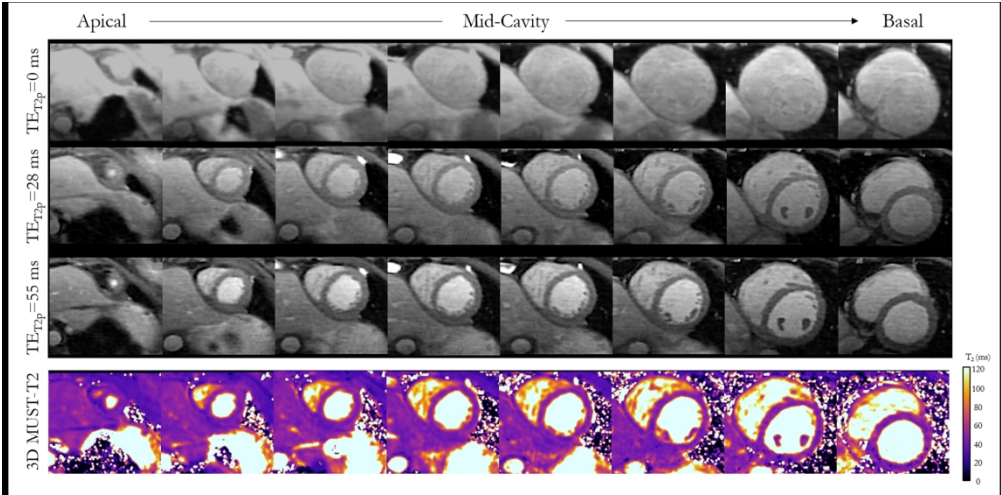


Figure 6. Three-dimensional visualization of the acquired T2w images and the corresponding T2 volume. Representative T2w images for subject 2 (acquisition time: 10 min, heart-rate = 38 bpm), and the corresponding T2 maps obtained by the proposed 3D MUST-T2. Eight reformatted short-axis slices that cover the heart from apex to base are shown. Uniform distribution of T2 values through the slices over the whole-left ventricle can be observed. The color scale indicates T2 values between 0-120 ms.

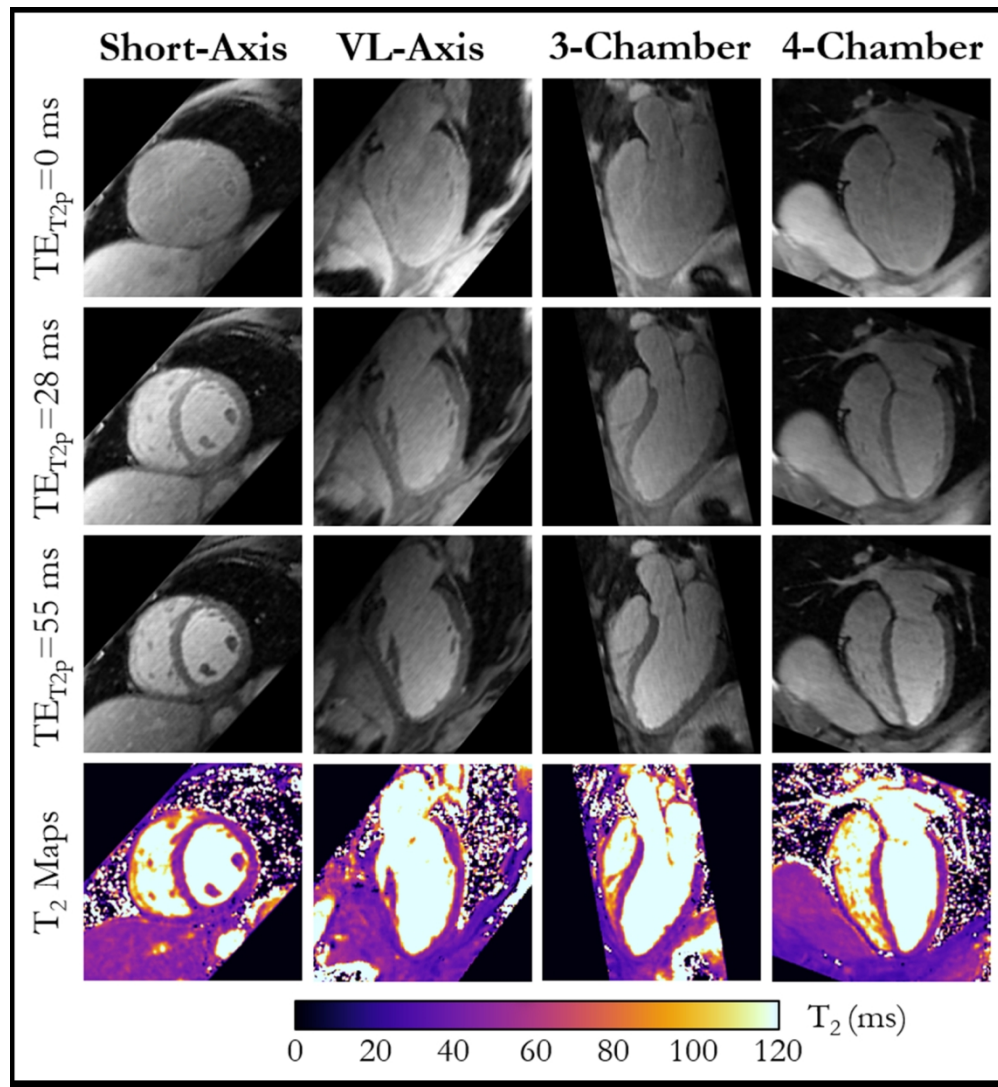


Figure 7. Representative T2-prepared images for subject 2 and the corresponding T2 maps obtained with the proposed 3D MUST-T2 sequence. Reformats in short-axis, vertical long-axis, 3-chamber and 4-chamber views are shown.

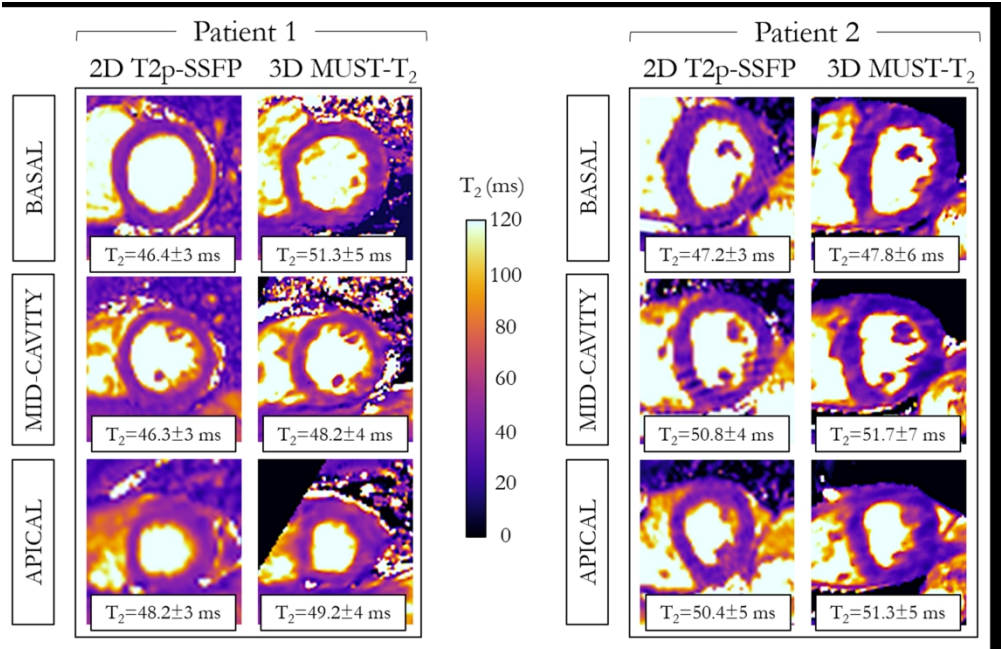


Figure 8. Short-axis T2 maps at apical, mid-ventricular and basal level for two patients acquired with the proposed free-breathing 3D MUST-T2 framework and the conventional breath-hold 2D T2p-SSFP sequence. The septal T2 relaxation times for each slice are reported as mean ± standard deviation.

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